

Spring for Apache Hadoop - Reference Documentation

2.4.0.RELEASE-cdh5

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Preface

Spring for Apache Hadoop provides extensions to Spring, Spring Batch, and Spring Integration to build manageable and robust pipeline solutions around Hadoop.

Spring for Apache Hadoop supports reading from and writing to HDFS, running various types of Hadoop jobs (Java MapReduce, Streaming), scripting and HBase, Hive and Pig interactions. An important goal is to provide excellent support for non-Java based developers to be productive using Spring for Apache Hadoop and not have to write any Java code to use the core feature set.

Spring for Apache Hadoop also applies the familiar Spring programming model to Java MapReduce jobs by providing support for dependency injection of simple jobs as well as a POJO based MapReduce programming model that decouples your MapReduce classes from Hadoop specific details such as base classes and data types.

This document assumes the reader already has a basic familiarity with the Spring Framework and Hadoop concepts and APIs.

While every effort has been made to ensure that this documentation is comprehensive and there are no errors, nevertheless some topics might require more explanation and some typos might have crept in. If you do spot any mistakes or even more serious errors and you can spare a few cycles during lunch, please do bring the error to the attention of the Spring for Apache Hadoop team by raising an issue. Thank you.

Part I. Introduction

Spring for Apache Hadoop provides integration with the Spring Framework to create and run Hadoop MapReduce, Hive, and Pig jobs as well as work with HDFS and HBase. If you have simple needs to work with Hadoop, including basic scheduling, you can add the Spring for Apache Hadoop namespace to your Spring based project and get going quickly using Hadoop. As the complexity of your Hadoop application increases, you may want to use Spring Batch and Spring Integration to regain on the complexity of developing a large Hadoop application.

This document is the reference guide for Spring for Apache Hadoop project (SHDP). It explains the relationship between the Spring framework and Hadoop as well as related projects such as Spring Batch and Spring Integration. The first part describes the integration with the Spring framework to define the base concepts and semantics of the integration and how they can be used effectively. The second part describes how you can build upon these base concepts and create workflow based solutions provided by the integration with Spring Batch.

1. Requirements

Spring for Apache Hadoop is built and tested with JDK 7, <u>Spring Framework</u> 4.2 and is by default built against <u>Apache Hadoop</u> 2.7.1.

Spring for Apache Hadoop supports the following versions and distributions:

- Apache Hadoop 2.7.1
- Apache Hadoop 2.6.0
- Pivotal HD 2.1
- Pivotal HD 3.0
- Cloudera CDH5
- Hortonworks Data Platform 2.3 and 2.4

Any distribution compatible with Apache Hadoop 2.2.x or later should be usable.

Spring for Apache Hadoop is tested daily against a number of Hadoop distributions. See the <u>test plan</u> page for current status.

Instructions for setting up project builds using various supported distributions are provided on the Spring for Apache Hadoop wiki - https://github.com/spring-projects/spring-hadoop/wiki

Regarding Hadoop-related projects, SHDP supports <u>HBase</u> 0.94.11, <u>Hive</u> 0.11.0 (As of version 2.3.0 we only support HiveServer2 using the JDBC driver) and <u>Pig</u> 0.11.0 and above. As a rule of thumb, when using Hadoop-related projects, such as Hive or Pig, use the required Hadoop version as a basis for discovering the supported versions.

To take full advantage of Spring for Apache Hadoop you need a running Hadoop cluster. If you don't already have one in your environment, a good first step is to create a single-node cluster. To install the most recent stable verision of Hadoop, the <u>Getting Started</u> page from the official Apache project is a good general guide. There should be a link for "Single Node Setup".

It is also convenient to download a Virtual Machine where Hadoop is setup and ready to go. Cloudera, Hortonworks and Pivotal all provide virtual machines and provide VM downloads on their product pages.

2. Additional Resources

While this documentation acts as a reference for Spring for Hadoop project, there are number of resources that, while optional, complement this document by providing additional background and code samples for the reader to try and experiment with:

- Spring for Apache Hadoop <u>samples</u>.
 Official repository full of SHDP samples demonstrating the various project features.
- Spring Data Book.
 Guide to Spring Data projects, written by the committers behind them. Covers Spring Data Hadoop stand-alone but in tandem with its siblings projects. All author royalties from book sales are donated to Creative Commons organization.
- Spring Data Book <u>examples</u>.
 Complete running samples for the Spring Data book. Note that some of them are available inside Spring for Apache Hadoop samples as well.

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Part II. Spring and Hadoop

This part of the reference documentation explains the core functionality that Spring for Apache Hadoop (SHDP) provides to any Spring based application.

Chapter 3, Hadoop Configuration describes the Spring support for generic Hadoop configuration.

Chapter 4, *MapReduce and Distributed Cache* describes the Spring support for bootstrapping, initializing and working with core Hadoop.

Chapter 5, Working with the Hadoop File System describes the Spring support for interacting with the Hadoop file system.

Chapter 6, Writing and reading data using the Hadoop File System describes the store abstraction support.

Chapter 7, Working with HBase describes the Spring support for HBase.

Chapter 8, Hive integration describes the Hive integration in SHDP.

Chapter 9, Pig support describes the Pig support in Spring for Apache Hadoop.

Chapter 11, Using the runner classes describes the runner support.

Chapter 12, Security Support describes how to configure and interact with Hadoop in a secure environment.

Chapter 13, Yarn Support describes the Hadoop YARN support.

Chapter 14, Testing Support describes the Spring testing integration.

3. Hadoop Configuration

One of the common tasks when using Hadoop is interacting with its *runtime* - whether it is a local setup or a remote cluster, one needs to properly configure and bootstrap Hadoop in order to submit the required jobs. This chapter will focus on how Spring for Apache Hadoop (SHDP) leverages Spring's lightweight loC container to simplify the interaction with Hadoop and make deployment, testing and provisioning easier and more manageable.

3.1 Using the Spring for Apache Hadoop Namespace

To simplify configuration, SHDP provides a dedicated namespace for most of its components. However, one can opt to configure the beans directly through the usual <bean> definition. For more information about XML Schema-based configuration in Spring, see this appendix in the Spring Framework reference documentation.

To use the SHDP namespace, one just needs to import it inside the configuration:

- Spring for Apache Hadoop namespace prefix. Any name can do but throughout the reference documentation, hdp will be used.
- The namespace URI.
- The namespace URI location. Note that even though the location points to an external address (which exists and is valid), Spring will resolve the schema locally as it is included in the Spring for Apache Hadoop library.
- Declaration example for the Hadoop namespace. Notice the prefix usage.

Once imported, the namespace elements can be declared simply by using the aforementioned prefix. Note that is possible to change the default namespace, for example from <beans> to <hdp>. This is useful for configuration composed mainly of Hadoop components as it avoids declaring the prefix. To achieve this, simply swap the namespace prefix declarations above:

- The default namespace declaration for this XML file points to the Spring for Apache Hadoop namespace.
- 2 The beans namespace prefix declaration.
- Bean declaration using the <beans> namespace. Notice the prefix.
- Bean declaration using the <hdp> namespace. Notice the lack of prefix (as hdp is the default namespace).

For the remainder of this doc, to improve readability, the XML examples may simply refer to the <hdp> namespace without the namespace declaration, where possible.

3.2 Using the Spring for Apache Hadoop JavaConfig

Annotation based configuration is designed to work via a SpringHadoopConfigurerAdapter which is loosely trying to use same type of dsl language familiar from xml. Within the adapter you need to override configure method which is exposing HadoopConfigConfigurer containing familiar attributes to work with a Hadoop configuration.

```
import org.springframework.context.annotation.Configuration;
import org.springframework.data.hadoop.config.annotation.EnableHadoop
import org.springframework.data.hadoop.config.annotation.SpringHadoopConfigurerAdapter
import org.springframework.data.hadoop.config.annotation.builders.HadoopConfigConfigurer;

@Configuration
@EnableHadoop
static class Config extends SpringHadoopConfigurerAdapter {

@Override
public void configure(HadoopConfigConfigurer config) throws Exception {
    config
        .fileSystemUri("hdfs://localhost:8021");
    }
}
```

Note

@EnableHadoop annotation is required to mark Spring @Configuration class to be a candidate for Spring Hadoop configuration.

3.3 Configuring Hadoop

In order to use Hadoop, one needs to first configure it namely by creating a Configuration object. The configuration holds information about the job tracker, the input, output format and the various other parameters of the map reduce job.

In its simplest form, the configuration definition is a one liner:

```
<hdp:configuration />
```

The declaration above defines a Configuration bean (to be precise a factory bean of type ConfigurationFactoryBean) named, by default, hadoopConfiguration. The default name is used, by conventions, by the other elements that require a configuration - this leads to simple and very concise configurations as the main components can automatically wire themselves up without requiring any specific configuration.

For scenarios where the defaults need to be tweaked, one can pass in additional configuration files:

```
<hdp:configuration resources="classpath:/custom-site.xml, classpath:/hq-site.xml">
```

In this example, two additional Hadoop configuration resources are added to the configuration.

Note

Note that the configuration makes use of Spring's <u>Resource</u> abstraction to locate the file. This allows various search patterns to be used, depending on the running environment or the prefix specified (if any) by the value - in this example the classpath is used.

In addition to referencing configuration resources, one can tweak Hadoop settings directly through Java Properties. This can be quite handy when just a few options need to be changed:

```
<?xml version="1.0" encoding="UTF-8"?>
<beans xmlns="http://www.springframework.org/schema/beans"
    xmlns:xsi="http://www.springframework.org/schema/hadoop"
    xmlns:hdp="http://www.springframework.org/schema/hadoop"
    xsi:schemaLocation="http://www.springframework.org/schema/beans http://www.springframework.org/schema/beans/spring-beans.xsd
    http://www.springframework.org/schema/hadoop http://www.springframework.org/schema/hadoop/
spring-hadoop.xsd">
    </hdp:configuration>
    fs.defaultFS=hdfs://localhost:8020
    hadoop.tmp.dir=/tmp/hadoop
    electric=sea
    </hdp:configuration>
</beans>
```

One can further customize the settings by avoiding the so called *hard-coded* values by externalizing them so they can be replaced at runtime, based on the existing environment without touching the configuration:

Note

Usual configuration parameters for fs.defaultFS, mapred.job.tracker and yarn.resourcemanager.address can be configured using tag attributes file-system-uri, job-tracker-uri and rm-manager-uri respectively.

```
<?xml version="1.0" encoding="UTF-8"?>
<beans xmlns="http://www.springframework.org/schema/beans"</pre>
   xmlns:xsi="http://www.w3.org/2001/XMLSchema-instance"
   xmlns:hdp="http://www.springframework.org/schema/hadoop"
   xmlns:context="http://www.springframework.org/schema/context"
   xsi:schemaLocation="http://www.springframework.org/schema/beans http://www.springframework.org/
schema/beans/spring-beans.xsd
       http://www.springframework.org/schema/context http://www.springframework.org/schema/context/
spring-context.xsd
       http://www.springframework.org/schema/hadoop/http://www.springframework.org/schema/hadoop/
spring-hadoop.xsd">
    <hdp:configuration>
       fs.defaultFS=${hd.fs}
       hadoop.tmp.dir=file://${java.io.tmpdir}
       hangar=${number:18}
     </hdp:configuration>
    <context:property-placeholder location="classpath:hadoop.properties" />
</beans>
```

Through Spring's property placeholder <u>support</u>, <u>SpEL</u> and the <u>environment abstraction</u>. one can externalize environment specific properties from the main code base easing the deployment across multiple machines. In the example above, the default file system is replaced based on the properties available in hadoop.properties while the temp dir is determined dynamically through SpEL. Both approaches offer a lot of flexibility in adapting to the running environment - in fact we use this approach extensivly in the Spring for Apache Hadoop test suite to cope with the differences between the different development boxes and the CI server.

Additionally, external Properties files can be loaded, Properties beans (typically declared through Spring's <u>util</u> namespace). Along with the nested properties declaration, this allows customized configurations to be easily declared:

```
<?xml version="1.0" encoding="UTF-8"?>
<beans xmlns="http://www.springframework.org/schema/beans"</pre>
   xmlns:xsi="http://www.w3.org/2001/XMLSchema-instance"
   xmlns:hdp="http://www.springframework.org/schema/hadoop"
   xmlns:context="http://www.springframework.org/schema/context"
   xmlns:util="http://www.springframework.org/schema/util"
   xsi:schemaLocation="http://www.springframework.org/schema/beans http://www.springframework.org/
schema/beans/spring-beans.xsd
       http://www.springframework.org/schema/context http://www.springframework.org/schema/context/
spring-context.xsd
       http://www.springframework.org/schema/util http://www.springframework.org/schema/util/spring-
util.xsd
       http://www.springframework.org/schema/hadoop/ http://www.springframework.org/schema/hadoop/
spring-hadoop.xsd">
   <!-- merge the local properties, the props bean and the two properties files -->
  <hdp:configuration properties-ref="props" properties-location="cfg-1.properties, cfg-2.properties">
     star=chasing
     captain=eo
   </hdp:configuration>
   <util:properties id="props" location="props.properties"/>
</beans>
```

When merging several properties, ones defined locally win. In the example above the configuration properties are the primary source, followed by the props bean followed by the external properties file based on their defined order. While it's not typical for a configuration to refer to so many properties, the example showcases the various options available.

Note

For more properties utilities, including using the System as a source or fallback, or control over the merging order, consider using Spring's PropertiesFactoryBean (which is what Spring for Apache Hadoop and util:properties use underneath).

It is possible to create configurations based on existing ones - this allows one to create dedicated configurations, slightly different from the main ones, usable for certain jobs (such as streaming - more on that #hadoop:job:streaming[below]). Simply use the configuration-ref attribute to refer to the parent configuration - all its properties will be inherited and overridden as specified by the child:

```
<!-- default name is 'hadoopConfiguration' -->
<hdp:configuration>
  fs.defaultFS=${hd.fs}
  hadoop.tmp.dir=file://${java.io.tmpdir}
</hdp:configuration>
<hdp:configuration id="custom" configuration-ref="hadoopConfiguration">
  fs.defaultFS=${custom.hd.fs}
</hdp:configuration>
...
```

Make sure though that you specify a different name since otherwise, because both definitions will have the same name, the Spring container will interpret this as being the same definition (and will usually consider the last one found).

Another option worth mentioning is register-url-handler which, as the name implies, automatically registers an URL handler in the running VM. This allows urls referencing *hdfs* resource (by using the hdfs prefix) to be properly resolved - if the handler is not registered, such an URL will throw an exception since the VM does not know what hdfs means.

Note

Since only one URL handler can be registered per VM, at most once, this option is turned off by default. Due to the reasons mentioned before, once enabled if it fails, it will log the error but will not throw an exception. If your hdfs URLs stop working, make sure to investigate this aspect.

Last but not least a reminder that one can mix and match all these options to her preference. In general, consider externalizing Hadoop configuration since it allows easier updates without interfering with the application configuration. When dealing with multiple, similar configurations use configuration composition as it tends to keep the definitions concise, in sync and easy to update.

Table 3.1. hdp:configuration attributes

Name	Values	Description
configuration ref	-Bean Reference	Reference to existing Configuration bean
properties- ref	Bean Reference	Reference to existing <i>Properties</i> bean
properties- location	Comma delimited list	List or Spring Resource paths

Name	Values	Description
resources	Comma delimited list	List or Spring Resource paths
register- url-handler	Boolean	Registers an HDFS url handler in the running VM. Note that this operation can be executed at most once in a given JVM hence the default is false. Defaults to false.
file-system- uri	String	The HDFS filesystem address. Equivalent to <i>fs.defaultFS</i> propertys.
job-tracker- uri	String	Job tracker address for HadoopV1. Equivalent to mapred.job.tracker property.
rm-manager- uri	String	The Yarn Resource manager address for HadoopV2. Equivalent to <i>yarn.resourcemanager.address</i> property.
user-keytab	String	Security keytab.
user- principal	String	User security principal.
namenode- principal	String	Namenode security principal.
rm-manager- principal	String	Resource manager security principal.
security- method	String	The security method for hadoop.

Note

Configuring security and kerberos refer to chapter Chapter 12, Security Support.

3.4 Boot Support

Spring Boot support is enabled automatically if spring-data-hadoop-boot-2.4.0.RELEASE-cdh5.jar is found from a classpath. Currently Boot auto-configuration is a little limited and only supports configuring of hadoopConfiguration and fsShell beans.

Configuration properties can be defined using various methods. See a Spring Boot documentation for details.

```
@Grab('org.springframework.data:spring-data-hadoop-boot:2.4.0.RELEASE-cdh5')
import org.springframework.data.hadoop.fs.FsShell
public class App implements CommandLineRunner {
    @Autowired FsShell shell
    void run(String... args) {
        shell.lsr("/tmp").each() {println "> ${it.path}"}
    }
}
```

Above example which can be run using Spring Boot CLI shows how auto-configuration ease use of Spring Hadoop. In this example Hadoop configuration and FsShell are configured automatically.

spring.hadoop configuration properties

Namespace spring.hadoop supports following properties; <u>fsUri</u>, <u>resourceManagerAddress</u>, <u>resourceManagerSchedulerAddress</u>, <u>resourceManagerHost</u>, <u>resourceManagerSchedulerPort</u>, <u>jobHistoryAddress</u>, <u>resources</u> and <u>config</u>.

```
spring.hadoop.fsUri
   Description
       A hdfs file system uri for a namenode.
   Required
       Yes
   Type
       String
   Default Value
       null
spring.hadoop.resourceManagerAddress
   Description
       Address of a YARN resource manager.
   Required
       No
   Type
       String
   Default Value
       null
spring.hadoop.resourceManagerSchedulerAddress
   Description
       Address of a YARN resource manager scheduler.
   Required
       No
   Type
       String
   Default Value
       null
spring.hadoop.resourceManagerHost
   Description
       Hostname of a YARN resource manager.
   Required
       No
```

```
Type
       String
   Default Value
       null
spring.hadoop.resourceManagerPort
   Description
       Port of a YARN resource manager.
   Required
       No
   Type
       Integer
   Default Value
       8032
spring.hadoop.resourceManagerSchedulerPort
   Description
       Port of a YARN resource manager scheduler. This property is only needed for an application
       master.
   Required
       No
   Type
       Integer
   Default Value
       8030
spring.hadoop.jobHistoryAddress
   Description
       Address of a MapReduce job history server.
   Required
       No
   Type
       String
   Default Value
       null
```

Description

spring.hadoop.resources

List of Spring resource locations to be initialized in Hadoop configuration. These resources should be in Hadoop's own site xml format and location format can be anything Spring supports. For example, *classpath:/myentry.xml* from a classpath or *file:/myentry.xml* from a file system.

Required

No

Type

List

Default Value

null

spring.hadoop.config

Description

Map of generic hadoop configuration properties.

This yml example shows howto set filesystem uri using config property instead of fsUri.

application.yml.

```
spring:
  hadoop:
  config:
    fs.defaultFS: hdfs://localhost:8020
```

Or:

application.yml.

```
spring:
  hadoop:
  config:
   fs:
    defaultFS: hdfs://localhost:8020
```

This example shows howto set same using properties format:

application.properties.

```
spring.hadoop.config.fs.defaultFS=hdfs://localhost:8020
```

Required

No

Type

Мар

Default Value

null

spring.hadoop.fsshell configuration properties

Namespace spring.hadoop.fsshell supports following properties; enabled

```
spring.hadoop.fsshell.enabled
```

Description

Defines if FsShell should be created automatically.

Required

No

Type Boolean

Default Value true

4. MapReduce and Distributed Cache

4.1 Creating a Hadoop Job

Once the Hadoop configuration is taken care of, one needs to actually submit some work to it. SHDP makes it easy to configure and run Hadoop jobs whether they are vanilla map-reduce type or streaming. Let us start with an example:

```
<hdp:job id="mr-job"
input-path="/input/" output-path="/ouput/"
mapper="org.apache.hadoop.examples.WordCount.TokenizerMapper"
reducer="org.apache.hadoop.examples.WordCount.IntSumReducer"/>
```

The declaration above creates a typical Hadoop Job: specifies its input and output, the mapper and the reducer classes. Notice that there is no reference to the Hadoop configuration above - that's because, if not specified, the default naming convention (hadoopConfiguration) will be used instead. Neither is there to the key or value types - these two are automatically determined through a best-effort attempt by analyzing the class information of the mapper and the reducer. Of course, these settings can be overridden: the former through the configuration-ref element, the latter through key and value attributes. There are plenty of options available not shown in the example (for simplicity) such as the jar (specified directly or by class), sort or group comparator, the combiner, the partitioner, the codecs to use or the input/output format just to name a few - they are supported, just take a look at the SHDP schema (?) or simply trigger auto-completion (usually CTRL+SPACE) in your IDE; if it supports XML namespaces and is properly configured it will display the available elements. Additionally one can extend the default Hadoop configuration object and add any special properties not available in the namespace or its backing bean (JobFactoryBean).

It is worth pointing out that per-job specific configurations are supported by specifying the custom properties directly or referring to them (more information on the pattern is available #hadoop:config:properties[here]):

```
<hdp:job id="mr-job"
  input-path="/input/" output-path="/ouput/"
  mapper="mapper class" reducer="reducer class"
  jar-by-class="class used for jar detection"
  properties-location="classpath:special-job.properties">
    electric=sea
</hdp:job>
```

<hdp:job> provides additional properties, such as the #hadoop:generic-options[generic options], however one that is worth mentioning is jar which allows a job (and its dependencies) to be loaded entirely from a specified jar. This is useful for isolating jobs and avoiding classpath and versioning collisions. Note that provisioning of the jar into the cluster still depends on the target environment - see the aforementioned #hadoop:generic-options[section] for more info (such as libs).

Creating a Hadoop Streaming Job

Hadoop Streaming job (or in short streaming), is a popular feature of Hadoop as it allows the creation of Map/Reduce jobs with any executable or script (the equivalent of using the previous counting words example is to use <u>cat</u> and <u>wc</u> commands). While it is rather easy to start up streaming from the command line, doing so programatically, such as from a Java environment, can be challenging due to the various number of parameters (and their ordering) that need to be parsed. SHDP simplifies such a task - it's as easy and straightforward as declaring a job from the previous section; in fact most of the attributes will be the same:

```
<hdp:streaming id="streaming"
input-path="/input/" output-path="/ouput/"
mapper="${path.cat}" reducer="${path.wc}"/>
```

Existing users might be wondering how they can pass the command line arguments (such as -D or -cmdenv). While the former customize the Hadoop configuration (which has been convered in the previous #hadoop:config[section]), the latter are supported through the cmd-env element:

Just like job, streaming supports the #hadoop:generic-options[generic options]; follow the link for more information.

4.2 Running a Hadoop Job

The jobs, after being created and configured, need to be submitted for execution to a Hadoop cluster. For non-trivial cases, a coordinating, workflow solution such as Spring Batch is recommended. However for basic job submission SHDP provides the <code>job-runner</code> element (backed by JobRunner class) which submits several jobs sequentially (and waits by default for their completion):

```
<hdp:job-runner id="myjob-runner" pre-action="cleanup-script" post-action="export-results" job-
ref="myjob" run-at-startup="true"/>
<hdp:job id="myjob" input-path="/input/" output-path="/output/"
    mapper="org.apache.hadoop.examples.WordCount.TokenizerMapper"
    reducer="org.apache.hadoop.examples.WordCount.IntSumReducer" />
```

Multiple jobs can be specified and even nested if they are not used outside the runner:

```
<hdp:job-runner id="myjobs-runner" pre-action="cleanup-script" job-ref="myjob1, myjob2" run-at-
startup="true"/>
<hdp:job id="myjob1" ... />
<hdp:job id="myjob1" ... />
```

One or multiple Map-Reduce jobs can be specified through the job attribute in the order of the execution. The runner will trigger the execution during the application start-up (notice the run-at-startup flag which is by default false). Do note that the runner will not run unless triggered manually or if run-at-startup is set to true. Additionally the runner (as in fact do all runners in SHDP) allows one or multiple pre and post actions to be specified to be executed before and after each run. Typically other runners (such as other jobs or scripts) can be specified but any JDK Callable can be passed in. For more information on runners, see the dedicated chapter.

Note

As the Hadoop job submission and execution (when wait-for-completion is true) is blocking, JobRunner uses a JDK Executor to start (or stop) a job. The default implementation, SyncTaskExecutor uses the calling thread to execute the job, mimicking the hadoop command line behaviour. However, as the hadoop jobs are time-consuming, in some cases this can lead to application freeze, preventing normal operations or even application shutdown from occurring

properly. Before going into production, it is recommended to double-check whether this strategy is suitable or whether a throttled or pooled implementation is better. One can customize the behaviour through the executor-ref parameter.

The job runner also allows running jobs to be cancelled (or killed) at shutdown. This applies only to jobs that the runner waits for (wait-for-completion is true) using a different executor then the default - that is, using a different thread then the calling one (since otherwise the calling thread has to wait for the job to finish first before executing the next task). To customize this behaviour, one should set the kill-job-at-shutdown attribute to false and/or change the executor-ref implementation.

Using the Hadoop Job tasklet

For Spring Batch environments, SHDP provides a dedicated tasklet to execute Hadoop jobs as a step in a Spring Batch workflow. An example declaration is shown below:

```
<hdp:job-tasklet id="hadoop-tasklet" job-ref="mr-job" wait-for-completion="true" />
```

The tasklet above references a Hadoop job definition named "mr-job". By default, wait-for-completion is true so that the tasklet will wait for the job to complete when it executes. Setting wait-for-completion to false will submit the job to the Hadoop cluster but not wait for it to complete.

4.3 Running a Hadoop Tool

It is common for Hadoop utilities and libraries to be started from the command-line (ex: hadoop jar some.jar). SHDP offers generic support for such cases provided that the packages in question are built on top of Hadoop standard infrastructure, namely Tool and ToolRunner classes. As opposed to the command-line usage, Tool instances benefit from Spring's IoC features; they can be parameterized, created and destroyed on demand and have their properties (such as the Hadoop configuration) injected.

Consider the typical jar example - invoking a class with some (two in this case) arguments (notice that the Hadoop configuration properties are passed as well):

```
bin/hadoop jar -conf hadoop-site.xml -jt darwin:50020 -Dproperty=value someJar.jar
```

Since SHDP has first-class support for #hadoop:config[configuring] Hadoop, the so called <code>generic</code> options aren't needed any more, even more so since typically there is only one Hadoop configuration per application. Through <code>tool-runner</code> element (and its backing <code>ToolRunner</code> class) one typically just needs to specify the <code>Tool</code> implementation and its arguments:

Additionally the runner (just like the job runner) allows one or multiple pre and post actions to be specified to be executed before and after each run. Typically other runners (such as other jobs or scripts) can be specified but any JDK Callable can be passed in. Do note that the runner will not run unless triggered manually or if run-at-startup is set to true. For more information on runners, see the dedicated chapter.

The previous example assumes the Tool dependencies (such as its class) are available in the classpath. If that is not the case, tool-runner allows a jar to be specified:

The jar is used to instantiate and start the tool - in fact all its dependencies are loaded from the jar meaning they no longer need to be part of the classpath. This mechanism provides proper isolation between tools as each of them might depend on certain libraries with different versions; rather then adding them all into the same app (which might be impossible due to versioning conflicts), one can simply point to the different jars and be on her way. Note that when using a jar, if the main class (as specified by the Main-Class entry) is the target Tool, one can skip specifying the tool as it will picked up automatically.

Like the rest of the SHDP elements, tool-runner allows the passed Hadoop configuration (by default hadoopConfiguration but specified in the example for clarity) to be #hadoop:config:properties[customized] accordingly; the snippet only highlights the property initialization for simplicity but more options are available. Since usually the Tool implementation has a default argument, one can use the tool-class attribute. However it is possible to refer to another Tool instance or declare a nested one:

This is quite convenient if the Tool class provides setters or richer constructors. Note that by default the tool-runner does not execute the Tool until its definition is actually called - this behavior can be changed through the run-at-startup attribute above.

Replacing Hadoop shell invocations with tool-runner

tool-runner is a nice way for migrating series or shell invocations or scripts into fully wired, managed Java objects. Consider the following shell script:

```
hadoop jar job1.jar -files fullpath:props.properties -Dconfig=config.properties ...
hadoop jar job2.jar arg1 arg2...
...
hadoop jar job10.jar ...
```

Each job is fully contained in the specified jar, including all the dependencies (which might conflict with the ones from other jobs). Additionally each invocation might provide some generic options or arguments but for the most part all will share the same configuration (as they will execute against the same cluster).

The script can be fully ported to SHDP, through the tool-runner element:

All the features have been explained in the previous sections but let us review what happens here. As mentioned before, each tool gets autowired with the hadoopConfiguration; job1 goes beyond this and uses its own properties instead. For the first jar, the Tool class is specified, however the rest assume

the jar _Main-Class_es implement the Tool interface; the namespace will discover them automatically and use them accordingly. When needed (such as with job1), additional files or libs are provisioned in the cluster. Same thing with the job arguments.

However more things that go beyond scripting, can be applied to this configuration - each job can have multiple properties loaded or declared inlined - not just from the local file system, but also from the classpath or any url for that matter. In fact, the whole configuration can be externalized and parameterized (through Spring's property placeholder and/or Environment abstraction). Moreover, each job can be ran by itself (through the JobRunner) or as part of a workflow - either through Spring's depends-on or the much more powerful Spring Batch and tool-tasklet.

Using the Hadoop Tool tasklet

For Spring Batch environments, SHDP provides a dedicated tasklet to execute Hadoop tasks as a step in a Spring Batch workflow. The tasklet element supports the same configuration options as #hadoop:tool-runner[tool-runner] except for run-at-startup (which does not apply for a workflow):

```
<hdp:tool-tasklet id="tool-tasklet" tool-ref="some-tool" />
```

4.4 Running a Hadoop Jar

SHDP also provides support for executing vanilla Hadoop jars. Thus the famous WordCount example:

```
bin/hadoop jar hadoop-examples.jar wordcount /wordcount/input /wordcount/output
```

becomes

Note

Just like the hadoop jar command, by default the jar support reads the jar's Main-Class if none is specified. This can be customized through the main-class attribute.

Additionally the runner (just like the job runner) allows one or multiple pre and post actions to be specified to be executed before and after each run. Typically other runners (such as other jobs or scripts) can be specified but any JDK Callable can be passed in. Do note that the runner will not run unless triggered manually or if run-at-startup is set to true. For more information on runners, see the dedicated chapter.

The jar support provides a nice and easy migration path from jar invocations from the command-line to SHDP (note that Hadoop #hadoop:generic-options[generic options] are also supported). Especially since SHDP enables Hadoop Configuration objects, created during the jar execution, to automatically inherit the context Hadoop configuration. In fact, just like other SHDP elements, the jar element allows #hadoop:config:properties[configurations properties] to be declared locally, just for the jar run. So for example, if one would use the following declaration:

inside the jar code, one could do the following:

```
assert "fast".equals(new Configuration().get("speed"));
```

This enabled basic Hadoop jars to use, without changes, the enclosing application Hadoop configuration.

And while we think it is a useful feature (that is why we added it in the first place), we strongly recommend using the tool support instead or migrate to it; there are several reasons for this mainly because there are *no contracts* to use, leading to very poor embeddability caused by:

• No standard Configuration injection

While SHDP does a best effort to pass the Hadoop configuration to the jar, there is no guarantee the jar itself does not use a special initialization mechanism, ignoring the passed properties. After all, a vanilla Configuration is not very useful so applications tend to provide custom code to address this.

• System.exit() calls

Most jar examples out there (including WordCount) assume they are started from the command line and among other things, call System.exit, to shut down the JVM, whether the code is successful or not. SHDP prevents this from happening (otherwise the entire application context would shutdown abruptly) but it is a clear sign of poor code collaboration.

SHDP tries to use sensible defaults to provide the best integration experience possible but at the end of the day, without any contract in place, there are no guarantees. Hence using the Tool interface is a much better alternative.

Using the Hadoop Jar tasklet

Like for the rest of its tasks, for Spring Batch environments, SHDP provides a dedicated tasklet to execute Hadoop jars as a step in a Spring Batch workflow. The tasklet element supports the same configuration options as #hadoop:jar-runner[jar-runner] except for run-at-startup (which does not apply for a workflow):

```
<hdp:jar-tasklet id="jar-tasklet" jar="some-jar.jar" />
```

4.5 Configuring the Hadoop DistributedCache

<u>DistributedCache</u> is a Hadoop facility for distributing application-specific, large, read-only files (text, archives, jars and so on) efficiently. Applications specify the files to be cached via urls (hdfs://) using <code>DistributedCache</code> and the framework will copy the necessary files to the slave nodes before any tasks for the job are executed on that node. Its efficiency stems from the fact that the files are only copied once per job and the ability to cache archives which are un-archived on the slaves. Note that <code>DistributedCache</code> assumes that the files to be cached (and specified via hdfs:// urls) are already present on the Hadoop <code>FileSystem</code>.

SHDP provides first-class configuration for the distributed cache through its cache element (backed by DistributedCacheFactoryBean class), allowing files and archives to be easily distributed across nodes:

```
<hdp:cache create-symlink="true">
  <hdp:classpath value="/cp/some-library.jar#library.jar" />
  <hdp:cache value="/cache/some-archive.tgz#main-archive" />
  <hdp:cache value="/cache/some-resource.res" />
  <hdp:local value="some-file.txt" />
  </hdp:cache>
```

The definition above registers several resources with the cache (adding them to the job cache or classpath) and creates symlinks for them. As described in the <code>DistributedCache documentation</code> the declaration format is (<code>absolute-path#link-name</code>). The link name is determined by the URI fragment (the text following the <code># such</code> as <code>#library.jar</code> or <code>#main-archive</code> above) - if no name is specified, the cache bean will infer one based on the resource file name. Note that one does not have to specify the <code>hdfs://node:port</code> prefix as these are automatically determined based on the configuration wired into the bean; this prevents environment settings from being hard-coded into the configuration which becomes portable. Additionally based on the resource extension, the definition differentiates between archives (<code>.tgz</code>, <code>.tar.gz</code>, <code>.zip</code> and <code>.tar</code>) which will be uncompressed, and regular files that are copied as-is. As with the rest of the namespace declarations, the definition above relies on defaults-since it requires a Hadoop Configuration and <code>FileSystem</code> objects and none are specified (through configuration-ref and <code>file-system-ref</code>) it falls back to the default naming and is wired with the bean named <code>hadoopConfiguration</code>, creating the <code>FileSystem</code> automatically.

Warning

Clients setting up a classpath in the DistributedCache, running on Windows platforms should set the System path.separator property to:. Otherwise the classpath will be set incorrectly and will be ignored; see HADOOP-9123 bug report for more information. There are multiple ways to change the path.separator System property - a quick one being a simple script in Javascript (that uses the Rhino package bundled with the JDK) that runs at start-up:

```
<hdp:script language="javascript" run-at-startup="true">
    // set System 'path.separator' to ':' - see HADOOP-9123
    java.lang.System.setProperty("path.separator", ":")
</hdp:script>
```

4.6 Map Reduce Generic Options

The job, streaming and tool all support a subset of *generic options*, specifically archives, files and libs. libs is probably the most useful as it enriches a job classpath (typically with some jars) - however the other two allow resources or archives to be copied throughout the cluster for the job to consume. Whenver faced with provisioning issues, revisit these options as they can help up significantly. Note that the fs, jt or conf options are not supported - these are designed for command-line usage, for bootstrapping the application. This is no longer needed, as the SHDP offers first-class support for defining and customizing Hadoop configurations.

5. Working with the Hadoop File System

A common task in Hadoop is interacting with its file system, whether for provisioning, adding new files to be processed, parsing results, or performing cleanup. Hadoop offers several ways to achieve that: one can use its Java API (namely FileSystem or use the hadoop command line, in particular the file system shell. However there is no middle ground, one either has to use the (somewhat verbose, full of checked exceptions) API or fall back to the command line, outside the application. SHDP addresses this issue by bridging the two worlds, exposing both the FileSystem and the fs shell through an intuitive, easy-to-use Java API. Add your favorite JVM scripting language right inside your Spring for Apache Hadoop application and you have a powerful combination.

5.1 Configuring the file-system

The Hadoop file-system, HDFS, can be accessed in various ways - this section will cover the most popular protocols for interacting with HDFS and their pros and cons. SHDP does not enforce any specific protocol to be used - in fact, as described in this section any FileSystem implementation can be used, allowing even other implementations than HDFS to be used.

The table below describes the common HDFS APIs in use:

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File System	Comm. Method	Scheme / Prefix	Read / Write	Cross Version
HDFS	RPC	hdfs://	Read / Write	Same HDFS version only
HFTP	НТТР	hftp://	Read only	Version independent
WebHDFS	HTTP (REST)	webhdfs://	Read / Write	Version independent

This chapter focuses on the core file-system protocols supported by Hadoop. S3, FTP and the rest of the other FileSystem implementations are supported as well - Spring for Apache Hadoop has no dependency on the underlying system rather just on the public Hadoop API.

hdfs:// protocol should be familiar to most readers - most docs (and in fact the previous chapter as well) mention it. It works out of the box and it's fairly efficient. However because it is RPC based, it requires both the client and the Hadoop cluster to share the same version. Upgrading one without the other causes serialization errors meaning the client cannot interact with the cluster. As an alternative one can use hftp:// which is HTTP-based or its more secure brother hsftp:// (based on SSL) which gives you a version independent protocol meaning you can use it to interact with clusters with an unknown or different version than that of the client. hftp is read only (write operations will fail right away) and it is typically used with distop for reading data. webhdfs:// is one of the additions in Hadoop 1.0 and is a mixture between hdfs and hftp protocol - it provides a version-independent, read-write, REST-based protocol which means that you can read and write to/from Hadoop clusters no matter their version. Furthermore, since webhdfs:// is backed by a REST API, clients in other languages can use it with minimal effort.

Note

Not all file systems work out of the box. For example WebHDFS needs to be enabled first in the cluster (through dfs.webhdfs.enabled property, see this document for more information) while the secure hftp, hsftp requires the SSL configuration (such as certificates) to be specified. More about this (and how to use hftp/hsftp for proxying) in this page.

Once the scheme has been decided upon, one can specify it through the standard Hadoop configuration, either through the Hadoop configuration files or its properties:

```
<hdp:configuration>
fs.defaultFS=webhdfs://localhost
...
</hdp:configuration>
```

This instructs Hadoop (and automatically SHDP) what the default, implied file-system is. In SHDP, one can create additional file-systems (potentially to connect to other clusters) and specify a different scheme:

```
<!-- manually creates the default SHDP file-system named 'hadoopFs' -->
<hdp:file-system uri="webhdfs://localhost"/>
<!-- creates a different FileSystem instance -->
<hdp:file-system id="old-cluster" uri="hftp://old-cluster/"/>
```

As with the rest of the components, the file systems can be injected where needed - such as file shell or inside scripts (see the next section).

5.2 Using HDFS Resource Loader

In Spring the ResourceLoader interface is meant to be implemented by objects that can return (i.e. load) Resource instances.

```
public interface ResourceLoader {
  Resource getResource(String location);
}
```

All application contexts implement the ResourceLoader interface, and therefore all application contexts may be used to obtain Resource instances.

When you call <code>getResource()</code> on a specific application context, and the location path specified doesn't have a specific prefix, you will get back a <code>Resource</code> type that is appropriate to that particular application context. For example, assume the following snippet of code was executed against a <code>ClassPathXmlApplicationContext</code> instance:

```
Resource template = ctx.getResource("some/resource/path/myTemplate.txt");
```

What would be returned would be a ClassPathResource; if the same method was executed against a FileSystemXmlApplicationContext instance, you'd get back a FileSystemResource. For a WebApplicationContext, you'd get back a ServletContextResource, and so on.

As such, you can load resources in a fashion appropriate to the particular application context.

On the other hand, you may also force ClassPathResource to be used, regardless of the application context type, by specifying the special classpath: prefix:

```
Resource template = ctx.getResource("classpath:some/resource/path/myTemplate.txt");
```

Note

More information about the generic usage of resource loading, check the *Spring Framework Documentation*.

Spring Hadoop is adding its own functionality into generic concept of resource loading. Resource abstraction in Spring has always been a way to ease resource access in terms of not having a need to know where there resource is and how it's accessed. This abstraction also goes beyond a single resource by allowing to use patterns to access multiple resources.

Lets first see how HdfsResourceLoader is used manually.

```
<hdp:file-system />
<hdp:resource-loader id="loader" file-system-ref="hadoopFs" />
<hdp:resource-loader id="loaderWithUser" user="myuser" uri="hdfs://localhost:8020" />
```

In above configuration we created two beans, one with reference to existing Hadoop FileSystem bean and one with impersonated user.

```
// get path '/tmp/file.txt'
Resource resource = loader.getResource("/tmp/file.txt");
// get path '/tmp/file.txt' with user impersonation
Resource resource = loaderWithUser.getResource("/tmp/file.txt");

// get path '/user/<current user>/file.txt'
Resource resource = loader.getResource("file.txt");
// get path '/user/myuser/file.txt'
Resource resource = loaderWithUser.getResource("file.txt");
// get all paths under '/tmp/'
Resource[] resources = loader.getResources("/tmp/*");
// get all paths under '/tmp/' recursively
Resource[] resources = loader.getResources("/tmp/**/*");
// get all paths under '/tmp/' using more complex ant path matching
Resource[] resources = loader.getResources("/tmp/?ile?.txt");
```

What would be returned in above examples would be instances of HdfsResources.

If there is a need for *Spring Application Context* to be aware of HdfsResourceLoader it needs to be registered using hdp:resource-loader-registrar namespace tag.

```
<hdp:file-system />
<hdp:resource-loader file-system-ref="hadoopFs" handle-noprefix="false" />
<hdp:resource-loader-registrar />
```

Note

On default the HdfsResourceLoader will handle all resource paths without prefix. Attribute handle-noprefix can be used to control this behaviour. If this attribute is set to *false*, non-prefixed resource uris will be handled by *Spring Application Context*.

```
// get 'default.txt' from current user's home directory
Resource[] resources = context.getResources("hdfs:default.txt");
// get all files from hdfs root
Resource[] resources = context.getResources("hdfs:/*");
// let context handle classpath prefix
Resource[] resources = context.getResources("classpath:cfg*properties");
```

What would be returned in above examples would be instances of HdfsResources and ClassPathResource for the last one. If requesting resource paths without existing prefix, this example

would fall back into *Spring Application Context*. It may be advisable to let HdfsResourceLoader to handle paths without prefix if your application doesn't rely on loading resources from underlying context without prefixes.

Table 5.2. hdp:resource-loader attributes

Name	Values	Description
file-system- ref	Bean Reference	Reference to existing Hadoop FileSystem bean
use-codecs	Boolean(defaul to true)	tsindicates whether to use (or not) the codecs found inside the Hadoop configuration when accessing the resource input stream.
user	String	The security user (ugi) to use for impersonation at runtime.
uri	String	The underlying HDFS system URI.
handle- noprefix	Boolean(defaul to true)	tsIndicates if loader should handle resource paths without prefix.

Table 5.3. hdp:resource-loader-registrar attributes

Name	Values	Description
loader-ref	Bean Reference	Reference to existing <i>Hdfs resource loader</i> bean. Default value is 'hadoopResourceLoader'.

5.3 Scripting the Hadoop API

SHDP scripting supports any <u>JSR-223</u> (also known as <code>javax.scripting</code>) compliant scripting engine. Simply add the engine jar to the classpath and the application should be able to find it. Most languages (such as Groovy or JRuby) provide JSR-233 support out of the box; for those that do not see the <u>scripting</u> project that provides various adapters.

Since Hadoop is written in Java, accessing its APIs in a *native* way provides maximum control and flexibility over the interaction with Hadoop. This holds true for working with its file systems; in fact all the other tools that one might use are built upon these. The main entry point is the org.apache.hadoop.fs.FileSystem abstract class which provides the foundation of most (if not all) of the actual file system implementations out there. Whether one is using a local, remote or distributed store through the FileSystem API she can query and manipulate the available resources or create new ones. To do so however, one needs to write Java code, compile the classes and configure them which is somewhat cumbersome especially when performing simple, straightforward operations (like copy a file or delete a directory).

JVM scripting languages (such as <u>Groovy</u>, <u>JRuby</u>, <u>Jython</u> or <u>Rhino</u> to name just a few) provide a nice solution to the Java language; they run on the JVM, can interact with the Java code with no or few changes or restrictions and have a nicer, simpler, less *ceremonial* syntax; that is, there is no need to define a class or a method - simply write the code that you want to execute and you are done. SHDP combines the two, taking care of the configuration and the infrastructure so one can interact with the Hadoop environment from her language of choice.

Let us take a look at a JavaScript example using Rhino (which is part of JDK 6 or higher, meaning one does not need any extra libraries):

```
<beans xmlns="http://www.springframework.org/schema/beans" ...>
    <hdp:configuration .../>
    <hdp:script id="inlined-js" language="javascript" run-at-startup="true">
        try {load("nashorn:mozilla_compat.js");} catch (e) {} // for Java 8
        importPackage(java.util);

    name = UUID.randomUUID().toString()
    scriptName = "src/test/resources/test.properties"
    // - FileSystem instance based on 'hadoopConfiguration' bean
    // call FileSystem#copyFromLocal(Path, Path)
    .copyFromLocalFile(scriptName, name)
    // return the file length
    .getLength(name)
    </hdp:script>

</beans>
```

The script element, part of the SHDP namespace, builds on top of the scripting support in Spring permitting script declarations to be evaluated and declared as normal bean definitions. Furthermore it automatically exposes Hadoop-specific objects, based on the existing configuration, to the script such as the FileSystem (more on that in the next section). As one can see, the script is fairly obvious: it generates a random name (using the UUID class from java.util package) and then copies a local file into HDFS under the random name. The last line returns the length of the copied file which becomes the value of the declaring bean (in this case inlined-js) - note that this might vary based on the scripting engine used.

Note

The attentive reader might have noticed that the arguments passed to the FileSystem object are not of type Path but rather String. To avoid the creation of Path object, SHDP uses a wrapper class SimplerFileSystem which automatically does the conversion so you don't have to. For more information see the implicit variables section.

Note that for inlined scripts, one can use Spring's property placeholder configurer to automatically expand variables at runtime. Using one of the examples seen before:

Notice how the script above relies on the property placeholder to expand fhd.fs with the values from hadoop.properties file available in the classpath.

As you might have noticed, the script element defines a runner for JVM scripts. And just like the rest of the SHDP runners, it allows one or multiple pre and post actions to be specified to be executed before and after each run. Typically other runners (such as other jobs or scripts) can be specified but any JDK Callable can be passed in. Do note that the runner will not run unless triggered manually or if run-at-startup is set to true. For more information on runners, see the dedicated chapter.

Using scripts

Inlined scripting is quite handy for doing simple operations and coupled with the property expansion is quite a powerful tool that can handle a variety of use cases. However when more logic is required or the script is affected by XML formatting, encoding or syntax restrictions (such as Jython/Python for which white-spaces are important) one should consider externalization. That is, rather than declaring the script directly inside the XML, one can declare it in its own file. And speaking of Python, consider the variation of the previous example:

```
<hdp:script location="org/company/basic-script.py" run-at-startup="true"/>
```

The definition does not bring any surprises but do notice there is no need to specify the language (as in the case of a inlined declaration) since script extension (py) already provides that information. Just for completeness, the basic-script.py looks as follows:

```
from java.util import UUID
from org.apache.hadoop.fs import Path

print "Home dir is " + str(fs.homeDirectory)
print "Work dir is " + str(fs.workingDirectory)
print "/user exists " + str(fs.exists("/user"))

name = UUID.randomUUID().toString()
scriptName = "src/test/resources/test.properties"
fs.copyFromLocalFile(scriptName, name)
print Path(name).makeQualified(fs)
```

5.4 Scripting implicit variables

To ease the interaction of the script with its enclosing context, SHDP binds by default the so-called *implicit* variables. These are:

Table 5.4. Implicit variables

Name	Туре	Description
cfg	Configuration	Hadoop Configuration (relies on hadoopConfiguration bean or singleton type match)
cl	ClassLoader	ClassLoader used for executing the script
ctx	<u>ApplicationContext</u>	Enclosing application context
ctxRL	ResourcePatternResolver	Enclosing application context ResourceLoader
distcp	<u>DistCp</u>	Programmatic access to DistCp
fs	FileSystem	Hadoop File System (relies on 'hadoop-fs' bean or singleton type match, falls back to creating one based on 'cfg')
fsh	<u>FsShell</u>	File System shell, exposing hadoop 'fs' commands as an API
hdfsRL	HdfsResourceLoader	Hdfs resource loader (relies on 'hadoop-resource-loader' or singleton type match, falls back to creating one automatically based on 'cfg')

Note

If no Hadoop Configuration can be detected (either by name hadoopConfiguration or by type), several log warnings will be made and none of the Hadoop-based variables (namely cfg, distcp, fs, fsh, distcp or hdfsRL) will be bound.

As mentioned in the *Description* column, the variables are first looked (either by name or by type) in the application context and, in case they are missing, created on the spot based on the existing configuration. Note that it is possible to override or add new variables to the scripts through the property sub-element that can set values or references to other beans:

```
<hdp:script location="org/company/basic-script.js" run-at-startup="true">
    <hdp:property name="foo" value="bar"/>
    <hdp:property name="ref" ref="some-bean"/>
</hdp:script>
```

Running scripts

The script namespace provides various options to adjust its behaviour depending on the script content. By default the script is simply declared - that is, no execution occurs. One however can change that so that the script gets evaluated at startup (as all the examples in this section do) through the run-at-startup flag (which is by default false) or when invoked manually (through the Callable). Similarly, by default the script gets evaluated on each run. However for scripts that are expensive and return the same value every time one has various *caching* options, so the evaluation occurs only when needed through the evaluate attribute:

Table 5.5. script attributes

Name	Values	Description
run-at- startup	false(default)	, Wether the script is executed at startup or not
evaluate	,	t)Wether to actually evaluate the script when invoked or used a previous value. ALWAYS means evaluate every time, IF_MODIFIED evaluate if the backing resource (such as a file) has been modified in the meantime and ONCE only once.

Using the Scripting tasklet

For Spring Batch environments, SHDP provides a dedicated tasklet to execute scripts.

```
<script-tasklet id="script-tasklet">
    <script language="groovy">
        inputPath = "/user/gutenberg/input/word/"
        outputPath = "/user/gutenberg/output/word/"
        if (fsh.test(inputPath)) {
            fsh.rmr(inputPath)
        }
        if (fsh.test(outputPath)) {
            fsh.rmr(outputPath)
        }
        inputFile = "src/main/resources/data/nietzsche-chapter-1.txt"
        fsh.put(inputFile, inputPath)
        </script>
        </script-tasklet>
```

The tasklet above embedds the script as a nested element. You can also declare a reference to another script definition, using the script-ref attribute which allows you to externalize the scripting code to an external resource.

```
<script-tasklet id="script-tasklet" script-ref="clean-up"/>
   <hdp:script id="clean-up" location="org/company/myapp/clean-up-wordcount.groovy"/>
```

5.5 File System Shell (FsShell)

A handy utility provided by the Hadoop distribution is the file system shell which allows UNIX-like commands to be executed against HDFS. One can check for the existence of files, delete, move, copy directories or files or set up permissions. However the utility is only available from the command-line which makes it hard to use from/inside a Java application. To address this problem, SHDP provides a lightweight, fully embeddable shell, called FsShell which mimics most of the commands available from the command line: rather than dealing with System.in or System.out, one deals with objects.

Let us take a look at using FsShell by building on the previous scripting examples:

```
chdp:script location="org/company/basic-script.groovy" run-at-startup="true"/>

name = UUID.randomUUID().toString()
scriptName = "src/test/resources/test.properties"
fs.copyFromLocalFile(scriptName, name)

// use the shell made available under variable
dir = "script-dir"
if (!fsh.test(dir)) {
   fsh.mkdir(dir); fsh.cp(name, dir); fsh.chmodr(700, dir)
   println "File content is " + fsh.cat(dir + name).toString()
}
println fsh.ls(dir).toString()
fsh.rmr(dir)
```

As mentioned in the previous section, a FsShell instance is automatically created and configured for scripts, under the name <code>fsh</code>. Notice how the entire block relies on the usual commands: test, <code>mkdir</code>, <code>cp</code> and so on. Their semantics are exactly the same as in the command-line version however one has access to a native Java API that returns actual objects (rather than <code>String`s</code>) <code>making</code> it easy to use them programmatically whether in Java or another language. Furthermore, the class offers enhanced methods (such as `chmodr which stands for <code>recursive chmod</code>) and multiple overloaded methods taking advantage of <code>varargs</code> so that multiple parameters can be specified. Consult the <code>API</code> for more information.

To be as close as possible to the command-line shell, FsShell mimics even the messages being displayed. Take a look at line 9 which prints the result of fsh.cat(). The method returns a Collection of Hadoop Path objects (which one can use programatically). However when invoking toString on the collection, the same printout as from the command-line shell is being displayed:

```
File content is
```

The same goes for the rest of the methods, such as ls. The same script in JRuby would look something like this:

```
require 'java'
name = java.util.UUID.randomUUID().to_s
scriptName = "src/test/resources/test.properties"
$fs.copyFromLocalFile(scriptName, name)

# use the shell
dir = "script-dir/"
...
print $fsh.ls(dir).to_s
```

which prints out something like this:

```
drwx----- - user supergroup 0 2012-01-26 14:08 /user/user/script-dir -rw-r--r-- 3 user supergroup 344 2012-01-26 14:08 /user/user/script-dir/520cf2f6-a0b6-427e-a232-2d5426c2bc4e
```

As you can see, not only can you reuse the existing tools and commands with Hadoop inside SHDP, but you can also code against them in various scripting languages. And as you might have noticed, there is no special configuration required - this is automatically inferred from the enclosing application context.

Note

The careful reader might have noticed that besides the syntax, there are some minor differences in how the various languages interact with the java objects. For example the automatic toString call called in Java for doing automatic String conversion is not necessarily supported (hence the to_s in Ruby or str in Python). This is to be expected as each language has its own semantics for the most part these are easy to pick up but do pay attention to details.

DistCp API

Similar to the FsShell, SHDP provides a lightweight, fully embeddable <u>DistCp</u> version that builds on top of the distcp from the Hadoop distro. The semantics and configuration options are the same however, one can use it from within a Java application without having to use the command-line. See the API for more information:

```
<hdp:script language="groovy">distcp.copy("${distcp.src}", "${distcp.dst}")</hdp:script>
```

The bean above triggers a distributed copy relying again on Spring's property placeholder variable expansion for its source and destination.

6. Writing and reading data using the Hadoop File System

The Store sub-project of Spring for Apache Hadoop provides abstractions for writing and reading various types of data residing in HDFS. We currently support different file types either via our own store accessors or by using the Dataset support in *Kite SDK*.

Currently, the Store sub-project doesn't have an XML namespace or javaconfig based configuration classes as it's considered to be a foundational library. However, this may change in future releases.

6.1 Store Abstraction

Native store abstractions provide various writer and reader interfaces so that the end user don't have to worry about the underlying implementation actually doing the work on files in HDFS. Implementations are usually strongly typed and provides constructors and setters for additional setup to work with naming, compression codecs and everything else defining the behaviour. Interfaces are meant to be used from integration components which don't need to know the internal workings of writers and readers.

Writing Data

Main interface writing into a store is a DataWriter which have one method write which simply writes an entity and the backing implementation will handle the rest.

```
public interface DataWriter<T> {
  void write(T entity) throws IOException;
}
```

The DataStoreWriter interface adds methods to close and flush a writer. Some of the writers have a property to close a stream after an idle time or a close time has been reached but generally this interface is meant for programmatic control of these operations.

```
public interface DataStoreWriter<T> extends DataWriter<T>, Flushable, Closeable {
}
```

File Naming

Different file naming strategies are used to automatically determine the name of a file to be used. Writers without additional naming configuration will usually use a given base path as is. As soon as any type of a strategy is configured, given base path is considered to be a base directory and the name of the file is resolved by file naming strategies.

For example, if defined base path is "/tmp/path" and the StaticFileNamingStrategy with "data" parameter is used then the actual file path resolved would be "/tmp/path/data".

```
Path path = new Path("/tmp/path");
Configuration config = new Configuration();
TextFileWriter writer = new TextFileWriter(config, path, null);
StaticFileNamingStrategy fileNamingStrategy = new StaticFileNamingStrategy("data")
writer.setFileNamingStrategy(fileNamingStrategy);
```

At first look this may feel a little complicated, but it will make sense after more file naming strategies are added. These will also provide facilities for using writers in parallel, or for a re-launched writer to be able to create a new file based on already existing files in the directry. For example,

RollingFileNamingStrategy will add a simple increasing value to a file name and will try to initialize itself with the correct position.

Built-in strategies currently supported are StaticFileNamingStrategy, RollingFileNamingStrategy, UuidFileNamingStrategy and CodecFileNamingStrategy. ChainedFileNamingStrategy can be used to chain multiple strategies together where each individual strategy will provide its own part.

File Rollover

File rolling strategy is used to determine a condition in a writer when a current stream should be automatically closed and the next file should be opened. This is usually done together with RollingFileNamingStrategy to rollover when a certain file size limit has been reached.

Currently, only one strategy SizeRolloverStrategy is supported.

Partitioning

Partitioning is a concept of choosing a target file on demand either based on content to be written or any other information available to a writer at the time of the write operation. While it would be perfectly alright to use multiple writers manually, the framework already does all the heavy lifting around partitioning. We work through interfaces and provide a generic default implementation still allowing to plug a customized version if there's a need for it.

PartitionStrategy is a strategy interface defining PartitionResolver and PartitionKeyResolver.

```
public interface PartitionStrategy<T,K> {
   PartitionResolver<K> getPartitionResolver();
   PartitionKeyResolver<T, K> getPartitionKeyResolver();
}
```

PartitionResolver is an interface used to resolve arbitrary partition keys into a path. We don't force any specific partition key type in the interface level itself but usually the implementation needs to be aware of its type.

```
public interface PartitionResolver<K> {
   Path resolvePath(K partitionKey);
}
```

PartitionKeyResolver is an interface which is responsible for creating a partition key from an entity. This is needed because writer interfaces allow us to write entities without an explicit partition key.

```
public interface PartitionKeyResolver<T, K> {
  K resolvePartitionKey(T entity);
}
```

PartitionDataStoreWriter is an extension of DataStoreWriter adding a method to write an entity with a partition key. In this context the partition key is something what the partition strategy is able to use.

```
public interface PartitionDataStoreWriter<T,K> extends DataStoreWriter<T> {
   void write(T entity, K partitionKey) throws IOException;
}
```

DefaultPartitionStrategy

DefaultPartitionStrategy is a generic default implementation meant to be used together with an expression using Spring's SpEL expression language. PartitionResolver used in

DefaultPartitionStrategy expects partition key to be a type of Map<String,Object> and partition key created by PartitionKeyResolver is a DefaultPartitionKey which itself is a Map<String,Object>.

In order to make it easy to work with SpEL and partitioning, map values can be directly accessed with keys and additional partitioning methods has been registered.

Partition Path Expression

SpEL expression is evaluated against a partition key passed into a HDFS writer.

Accessing Properties

If partition key is a type of Map any property given to a SpEL expression is automatically resolved from a map.

Custom Methods

In addition to normal SpEL functionality, a few custom methods have been added to make it easier to build partition paths. These custom methods can be used to work with normal partition concepts like date formatting, lists, ranges and hashes.

path

```
path(String... paths)
```

You can concatenate paths together with a / delimiter. This method can be used to make the expression less verbose than using a native SpEL functionality to combine path parts together. To create a path part1/part2, expression 'part1' + '/' + 'part2' is equivalent to path('part1', 'part2').

Parameters

paths

Any number of path parts

Return Value

Concatenated value of paths delimited with /.

dateFormat

```
dateFormat(String pattern)
dateFormat(String pattern, Long epoch)
dateFormat(String pattern, Date date)
dateFormat(String pattern, String datestring)
dateFormat(String pattern, String datestring, String dateformat)
```

Creates a path using date formatting. Internally this method delegates to SimpleDateFormat and needs a Date and a pattern.

Method signature with three parameters can be used to create a custom Date object which is then passed to SimpleDateFormat conversion using a dateformat pattern. This is useful in use cases where partition should be based on a date or time string found from a payload content itself. Default dateformat pattern if omitted is *yyyy-MM-dd*.

Parameters

pattern

Pattern compatible with SimpleDateFormat to produce a final output.

epoch

Timestamp as Long which is converted into a Date.

date

A Date to be formatted.

dateformat

Secondary pattern to convert datestring into a Date.

datestring

Date as a String

Return Value

A path part representation which can be a simple file or directory name or a directory structure.

list

```
list(Object source, List<List<Object>> lists)
```

Creates a partition path part by matching a source against a lists denoted by lists.

Lets assume that data is being written and it's possible to extract an *appid* from the content. We can automatically do a list based partition by using a partition method *list(appid, \\\\'1TO3','APP1','APP2','APP3'\},\\'4TO6','APP4','APP5','APP6'\}\). This method would create three partitions, <i>1TO3_list*, *4TO6_list* and *list*. The latter is used if no match is found from partition lists passed to lists.

Parameters

source

An Object to be matched against lists.

lists

A definition of list of lists.

Return Value

A path part prefixed with a matched key i.e. XXX_list or list if no match.

range

```
range(Object source, List<Object> list)
```

Creates a partition path part by matching a source against a list denoted by *list* using a simple binary search.

The partition method takes source as first argument and a list as the second argument. Behind the scenes this is using the JVM's binarySearch which works on an Object level so we can pass in anything. Remember that meaningful range match only works if passed in Object and types in list are of same type like Integer. Range is defined by a binarySearch itself so mostly it is to match against an upper bound except the last range in a list. Having a list of \{1000,3000,5000\} means that everything above 3000 will be matched with 5000. If that is an issue then simply adding \textit{Integer.MAX_VALUE} as last range would overflow everything above 5000 into a new partition. Created partitions would then be \textit{1000_range}, \textit{3000_range} and \textit{5000_range}.

Parameters

source

An Object to be matched against list.

list

A definition of list.

Return Value

A path part prefixed with a matched key i.e. XXX_range.

hash

```
hash(Object source, int bucketcount)
```

Creates a partition path part by calculating hashkey using source's hashCode and bucketcount. Using a partition method *hash(timestamp,2)* would then create partitions named *0_hash*, *1_hash* and *2_hash*. Number suffixed with *hash is simply calculated using _Object.hashCode() % bucketcount.*

Parameters

source

An Object which hashCode will be used.

bucketcount

A number of buckets

Return Value

A path part prefixed with a hash key i.e. XXX_hash.

Creating a Custom Partition Strategy

Creating a custom partition strategy is as easy as just implementing needed interfaces. Custom strategy may be needed in use cases where it is just not feasible to use SpEL expressions. This will then give total flexibility to implement partitioning as needed.

Below sample demonstrates how a simple customer id could be used as a base for partitioning.

```
public class CustomerPartitionStrategy implements PartitionStrategy<String, String> {
 CustomerPartitionResolver partitionResolver = new CustomerPartitionResolver();
 CustomerPartitionKeyResolver keyResolver = new CustomerPartitionKeyResolver();
 public PartitionResolver<String> getPartitionResolver() {
   return partitionResolver;
 public PartitionKeyResolver<String, String> getPartitionKeyResolver() {
   return keyResolver;
public class CustomerPartitionResolver implements PartitionResolver<String> {
 @Override
 public Path resolvePath(String partitionKey) {
   return new Path(partitionKey);
}
public class CustomerPartitionKeyResolver implements PartitionKeyResolver<String, String> {
 public String resolvePartitionKey(String entity) {
    if (entity.startsWith("customer1")) {
     return "customer1";
   } else if (entity.startsWith("customer2")) {
     return "customer2";
    } else if (entity.startsWith("customer3")) {
     return "customer3";
   return null;
```

Writer Implementations

We provide a number of writer implementations to be used based on the type of file to write.

- TextFileWriter.
 - an implementation meant to write a simple text data where entities are separated by a delimiter. Simple example for this is a text file with line terminations.
- DelimitedTextFileWriter.
 - an extension atop of TextFileWriter where written entity itself is also delimited. Simple example for this is a csv file.
- TextSequenceFileWriter.
 a similar implementation to TextFileWriter except that backing file is a Hadoop's SequenceFile.
- PartitionTextFileWriter.
 wraps multiple TextFileWriters providing automatic partitioning functionality.

Append and Sync Data

HDFS client library which is usually referred as a *DFS Client* is using a rather complex set of buffers to make writes fast. Using a compression codec adds yet another internal buffer. One big problem with these buffers is that if a jvm suddenly dies bufferred data is naturally lost.

With TextFileWriter and TextSequenceFileWriter it is possible to enable either append or syncable mode which effectively is causing our store libraries to call sync method which will flush buffers from a client side into a currently active datanodes.

Note

Appending or synching data will be considerably slower than a normal write. It is always a trade-off between fast write and data integrity. Using append or sync with a compression is also problematic because it's up to a codec implementation when it can actually flush its own data to a datanode.

Reading Data

Main interface reading from a store is a DataReader.

```
public interface DataReader<T> {
  T read() throws IOException;
}
```

DataStoreReader is an extension of DataReader providing close method for a reader.

```
public interface DataStoreReader<T> extends DataReader<T>, Closeable {
}
```

Input Splits

Some of the HDFS storage and file formats can be read using an input splits instead of reading a whole file at once. This is a fundamental concept in Hadoop's MapReduce to parallelize data processing. Instead of reading a lot of small files, which would be a source of a Hadoop's "small file problem", one large file can be used. However one need to remember that not all file formats support input splitting especially when compression is used.

Support for reading input split is denoted via a Split interface which simply mark starting and ending positions.

```
public interface Split {
  long getStart();
  long getLength();
  long getEnd();
}
```

Interface Splitter defines an contract how Split's are calculate from a given path.

```
public interface Splitter {
  List<Split> getSplits(Path path) throws IOException;
}
```

We provide few generic Splitter implementations to construct Split's.

StaticLengthSplitter is used to split input file with a given length.

StaticBlockSplitter is used to split input by used HDFS file block size. It's also possible to split further down the road within the blocks itself.

SlopBlockSplitter is an extension of StaticBlockSplitter which tries to estimate how much a split can overflow to a next block to taggle unnecessary overhead if last file block is very small compared to an actual split size.

Reader Implementations

We provide a number of reader implementations to be used based on the type of file to read.

- TextFileReader. used to read data written by a TextFileWriter.
- DelimitedTextFileReader.
 used to read data writte by a DelimitedTextFileWriter.
- TextSequenceFileReader.
 used to read data written by a TextSequenceFileWriter.

Using Codecs

Supported compression codecs are denoted via an interface CodecInfo which simply defines if codec supports splitting, what is it's fully qualified java class and what is its default file suffix.

```
public interface CodecInfo {
  boolean isSplittable();
  String getCodecClass();
  String getDefaultSuffix();
}
```

Codecs provides an enum for easy access to supported codecs.

- GZIP org.apache.hadoop.io.compress.GzipCodec
- SNAPPY org.apache.hadoop.io.compress.SnappyCodec
- BZIP2 org.apache.hadoop.io.compress.BZip2Codec
- LZO com.hadoop.compression.lzo.LzoCodec
- LZOP com.hadoop.compression.lzo.LzopCodec

Note

Lzo based compression codecs doesn't exist in maven dependencies due to licensing restrictions and need for native libraries. Order to use it add codec classes to classpath and its native libs using *java.library.path*.

6.2 Persisting POJO datasets using Kite SDK

One common requirement is to persist a large number of POJOs in serialized form using HDFS. The Kite SDK project provides a Kite Data Module that provides an API for working with datasets stored in HDFS. We are using this functionality and provide a some simple helper classes to aid in configuration and use in a Spring environment.

Data Formats

The Kite SDK project provides support for writing data using both the <u>Avro</u> and <u>Parquet</u> data formats. The data format you choose to use influences the data types you can use in your POJO classes. We'll discuss the basics of the Java type mapping for the two data formats but we recommend that you consult each project's documentation for additional details.

Note

Currently, you can't provide your own schema. This is something that we are considering changing in upcomming releases. We are also planning to provide better mapping support in line with the support we currently provide for NoSQL stores like MongoDB.

Using Avro

When using Avro as the data format the schema generation is based on reflection of thet POJO class used. Primitive data types and their corresponding wrapper classes are mapped to the corresponding Avro data type. More complex types, as well as the POJO itself, are mapped to a record type consisting of one or more fields.

The table below shows the mapping from some common types:

Table 6.1. Some common Java to Avro data types mapping

Java type	Avro type	Comment
String	string	[multiblock cell omitted]
int / Integer	int	32-bit signed integer
long / Long	long	64-bit signed integer
float / Float	float	32-bit floating point
double / Double	double	64-bit floating point
boolean / Boolean	boolean	[multiblock cell omitted]
byte[]	bytes	byte array
java.util.Date	record	[multiblock cell omitted]

Using Parquet

When using Parquet as the data format the schema generation is based on reflection of thet POJO class used. The POJO class must be a proper JavaBean and not have any nested types. We only support primitive data types and their corresponding wrapper classes plus byte arrays. We do rely on the Avroto-Parquet mapping support that the Kite SDK uses, so the schema will be generated by Avro.

Note

The Parquet support we currently povide is considered experimental. We are planning to relax a lot of the restrictions on the POJO class in upcoming releases.

The table below shows the mapping from some common types:

Table 6.2. Some common Java to Parquet data types mapping

Java type	Parquet type	Comment
String	BINARY/UTF8	[multiblock cell omitted]

Java type	Parquet type	Comment
int / Integer	INT32	32-bit signed integer
long / Long	INT64	64-bit signed integer
float / Float	FLOAT	32-bit floating point
double / Double	DOUBLE	64-bit floating point
boolean / Boolean	BOOLEAN	[multiblock cell omitted]
byte[]	BINARY/BYTE_ARRAY	byte array

Configuring the dataset support

In order to use the dataset support you need to configure the following classes:

- DatasetRepositoryFactory that needs a org.apache.hadoop.conf.Configuration so we know how to connect to HDFS and a base path where the data will be written.
- DatasetDefinition that defines the dataset you are writing. Configuration options include the POJO class that is being stored, the type of format to use (Avro or Parquet). You can also specify whether to allow null values for all fields (default is *false*) and an optional partition strategy to use for the dataset (see below for partitioning).

The following example shows a simple configuration class:

```
@Configuration
@ImportResource("hadoop-context.xml")
public class DatasetConfig {
 private @Autowired org.apache.hadoop.conf.Configuration hadoopConfiguration;
 @Bean
 public DatasetRepositoryFactory datasetRepositoryFactory() {
   DatasetRepositoryFactory datasetRepositoryFactory = new DatasetRepositoryFactory();
   datasetRepositoryFactory.setConf(hadoopConfiguration);
   datasetRepositoryFactory.setBasePath("/user/spring");
   return datasetRepositoryFactory;
 public DatasetDefinition fileInfoDatasetDefinition() {
   DatasetDefinition definition = new DatasetDefinition();
   definition.setFormat(Formats.AVRO.getName());
   definition.setTargetClass(FileInfo.class);
   definition.setAllowNullValues(false);
   return definition;
```

Writing datasets

To write datasets to Hadoop you should use either the AvroPojoDatasetStoreWriter or the ParquetDatasetStoreWriter depending on the data format you want to use.

Tip

To mark your fields as nullable use the @Nullable annotation (org.apache.avro.reflect.Nullable). This will result in the schema defining your field as a *union* of *null* and your datatype.

We are using a FileInfo POJO that we have defined to hold some information based on the files we read from our local file system. The dataset will be stored in a directory that is the name of the class using lowercase, so in this case it would be *fileinfo*. This directory is placed inside the *basePath* specified in the configuration of the DatasetRepositoryFactory.:

```
package org.springframework.samples.hadoop.dataset;
import org.apache.avro.reflect.Nullable;
public class FileInfo {
 private String name;
 private @Nullable String path;
 private long size;
 private long modified;
 public FileInfo(String name, String path, long size, long modified) {
   this.name = name;
   this.path = path;
   this.modified = modified;
 public FileInfo() {
 public String getName() {
     return name;
  public String getPath() {
     return path;
 public long getSize() {
     return size;
 public long getModified() {
     return modified;
```

To create a writer add the following bean definition to your configuration class:

Next, have your class use the writer bean:

```
private DataStoreWriter<FileInfo> writer;

@Autowired
public void setDataStoreWriter(DataStoreWriter dataStoreWriter) {
    this.writer = dataStoreWriter;
}
```

Now we can use the writer, it will be opened automatically once we start writing to it:

```
FileInfo fileInfo = new FileInfo(file.getName(),
    file.getParent(), (int)file.length(), file.lastModified());
writer.write(fileInfo);
```

Once we are done writing we should close the writer:

```
try {
   writer.close();
} catch (IOException e) {
   throw new StoreException("Error closing FileInfo", e);
}
```

We should now have dataset containing all the *FileInfo* entries in a /user/spring/demo/fileinfo directory:

The .metadata directory contains dataset information including the Avro schema:

```
$ hdfs dfs -cat /user/spring/fileinfo/.metadata/schema.avsc
  "type" : "record",
  "name" : "FileInfo",
  "namespace" : "org.springframework.samples.hadoop.dataset",
  "fields" : [ {
   "name" : "name".
   "type" : "string"
 }, {
   "name" : "path",
   "type" : [ "null", "string" ],
   "default" : null
 }, {
    "name" : "size",
   "type" : "long"
 }, {
   "name" : "modified",
   "type" : "long"
 } ]
}
```

Reading datasets

To read datasets to Hadoop we use the DatasetTemplate class.

To create a DatasetTemplate add the following bean definition to your configuration class:

```
public DatasetOperations datasetOperations() {
  DatasetTemplate datasetOperations = new DatasetTemplate();
  datasetOperations.setDatasetRepositoryFactory(datasetRepositoryFactory());
  return datasetOperations;
}
```

Next, have your class use the DatasetTemplate:

```
private DatasetOperations datasetOperations;

@Autowired
public void setDatasetOperations(DatasetOperations datasetOperations) {
    this.datasetOperations = datasetOperations;
}
```

Now we can read and count the entries using a RecordCallback callback interface that gets called once per retrieved record:

```
final AtomicLong count = new AtomicLong();
datasetOperations.read(FileInfo.class, new RecordCallback<FileInfo>() {
    @Override
    public void doInRecord(FileInfo record) {
        count.getAndIncrement();
     }
});
System.out.println("File count: " + count.get());
```

Partitioning datasets

To create datasets that are partitioned on one or more data fields we use the PartitionStrategy.Builder class that the *Kite SDK* project provides.

```
DatasetDefinition definition = new DatasetDefinition();
definition.setPartitionStrategy(new PartitionStrategy.Builder().year("modified").build());
```

This option lets you specify one or more paths that will be used to partition the files that the data is written to based on the content of the data. You can use any of the FieldPartitioners that are available for the *Kite SDK* project. We simply use what is specified to create the corresponding partition strategy. The following partitioning functions are available:

- year, month, day, hour, minute creates partitions based on the value of a timestamp and creates directories named like "YEAR=2014" (works well with fields of datatype long)
 - · specify function plus field name like:

```
year("timestamp")
```

• optionally, specify a partition name to replace the default one:

```
year("timestamp", "YY")
```

- dateformat creates partitions based on a timestamp and a dateformat expression provided creates directories based on the name provided (works well with fields of datatype long)
 - specify function plus field name, a name for the partition and the date format like:

```
dateFormat("timestamp", "Y-M", "yyyyMM")
```

- range creates partitions based on a field value and the upper bounds for each bucket that is specified (works well with fields of datatype int and string)
 - specify function plus field name and the upper bounds for each partition bucket like:

```
range("age", 20, 50, 80, Integer.MAX_VALUE)
```

- identity creates partitions based on the exact value of a field (works well with fields of datatype string, long and int)
 - specify function plus field name, a name for the partition, the type of the field (String or Integer) and the number of values/buckets for the partition like:

```
identity("region", "R", String.class, 10)
```

 hash creates partitions based on the hash calculated from the value of a field divided into a number of buckets that is specified (works well with all data types) • specify function plus field name and number of buckets like:

```
hash("lastname", 10)
```

Multiple expressions can be specified by simply chaining them like:

```
identity("region", "R", String.class, 10).year("timestamp").month("timestamp")
```

6.3 Using the Spring for Apache JavaConfig

Spring Hadoop doesn't have support for configuring store components using xml but have a support using JavaConfig for writer configuration.

JavaConfig is using same concepts found from other parts of a Spring Hadoop where whole configuration logic works around use of an adapter.

```
@Configuration
@EnableDataStoreTextWriter
static class Config
    extends SpringDataStoreTextWriterConfigurerAdapter {

    @Override
    public void configure(DataStoreTextWriterConfigurer config)
        throws Exception {
        config
            .basePath("/tmp/foo");
    }
}
```

What happened in above example:

- We created a normal Spring @Configuration class extending SpringDataStoreTextWriterConfigurerAdapter.
- Class needs to be annotated with EnableDataStoreTextWriter order to enable some needed functionality.
- Override configure method having DataStoreTextWriterConfigurer as its argument.
- Set writer base path to /tmp/foo.
- Bean of type <u>DataStoreWriter</u> is created automatically.

We can also do configuration for other usual properties like, idleTimeout, closeTimeout, partitioning strategy, naming strategy and rollover strategy.

```
@Configuration
@EnableDataStoreTextWriter
static class Config
   extends SpringDataStoreTextWriterConfigurerAdapter {
 public void configure(DataStoreTextWriterConfigurer config)
     throws Exception {
   config
     .basePath("/tmp/store")
     .idleTimeout(60000)
     .closeTimeout(120000)
     .inWritingSuffix(".tmp")
     .withPartitionStrategy()
       .map("dateFormat('yyyy/MM/dd/HH/mm', timestamp)")
        .and()
     .withNamingStrategy()
        .name("data")
       .uuid()
       .rolling()
       .name("txt", ".")
        .and()
     .withRolloverStrategy()
       .size("1M");
  }
}
```

What happened in above example:

- We set idle timeout meaning file will be closed automatically if no writes are done in 60 seconds.
- We set close timeout meaning file will be closed automatically when 120 seconds has been elapsed.
- We set the in-writing suffix to .tmp which will indicate that file is currently open for writing. Writer will automatically remove this suffix when file is closed.
- We defined a partitioning strategy using date format <code>yyyy/MM/dd/HH/mm</code>. This will partition data based on timestamp when write operation happens.
- We defined naming strategy so that file would have name data-38400000-8cf0-11bd-b23e-10b96e4ef00d-1.txt.
- We set file to rollover after 1M data is written.

Writer can be auto-wired using DataStoreWriter.

Important

Autowiring by type PartitionDataStoreWriter only works if adapter is used with annotation @EnableDataStorePartitionTextWriter which will introduce a correct bean type.

```
static class MyBean {
    @Autowired
    DataStoreWriter<String> writer;

    @Autowired
    PartitionDataStoreWriter<String, Map<String, Object>> writer;
}
```

In some cases it is more convenient to name the bean instead letting Spring to create that name automatically. @EnableDataStoreTextWriter and @EnableDataStorePartitionTextWriter

both have a name field which works in a same way than normal Spring @Bean annotation. You'd use this custom naming in cases where multiple writers are created and auto-wiring by type would no longer work.

```
@Configuration
@EnableDataStoreTextWriter(name={"mywriter", "myalias"})
static class Config
   extends SpringDataStoreTextWriterConfigurerAdapter {
}
```

In above example bean was created with a name mywriter having an alias named myalias.

7. Working with HBase

SHDP provides basic configuration for <u>HBase</u> through the hbase-configuration namespace element (or its backing HbaseConfigurationFactoryBean).

```
<!-- default bean id is 'hbaseConfiguration' that uses the existing 'hadoopCconfiguration' object -->
<hdp:hbase-configuration configuration-ref="hadoopCconfiguration" />
```

The above declaration does more than easily create an HBase configuration object; it will also manage the backing HBase connections: when the application context shuts down, so will any HBase connections opened - this behavior can be adjusted through the stop-proxy and delete-connection attributes:

```
<!-- delete associated connections but do not stop the proxies -->
<hdp:hbase-configuration stop-proxy="false" delete-connection="true">
  foo=bar
  property=value
</hdp:hbase-configuration>
```

Additionally, one can specify the ZooKeeper port used by the HBase server - this is especially useful when connecting to a remote instance (note one can fully configure HBase including the ZooKeeper host and port through properties; the attributes here act as shortcuts for easier declaration):

```
<!-- specify ZooKeeper host/port -->
<hdp:hbase-configuration zk-quorum="${hbase.host}" zk-port="${hbase.port}">
```

Notice that like with the other elements, one can specify additional properties specific to this configuration. In fact hbase-configuration provides the same properties configuration knobs as hadoop configuration:

```
<hdp:hbase-configuration properties-ref="some-props-bean" properties-location="classpath:/conf/testing/
hbase.properties"/>
```

7.1 Data Access Object (DAO) Support

One of the most popular and powerful feature in Spring Framework is the Data Access Object (or DAO) <u>support</u>. It makes dealing with data access technologies easy and consistent allowing easy switch or interconnection of the aforementioned persistent stores with minimal friction (no worrying about catching exceptions, writing boiler-plate code or handling resource acquisition and disposal). Rather than reiterating here the value proposal of the DAO support, we recommend the JDBC <u>section</u> in the Spring Framework reference documentation

SHDP provides the same functionality for Apache HBase through its org.springframework.data.hadoop.hbase package: an HbaseTemplate along with several callbacks such as TableCallback, RowMapper and ResultsExtractor that remove the low-level, tedious details for finding the HBase table, run the query, prepare the scanner, analyze the results then clean everything up, letting the developer focus on her actual job (users familiar with Spring should find the class/method names quite familiar).

At the core of the DAO support lies <code>HbaseTemplate</code> - a high-level abstraction for interacting with HBase. The template requires an HBase configuration, once it's set, the template is thread-safe and can be reused across multiple instances at the same time:

```
// default HBase configuration
<hdp:hbase-configuration/>

// wire hbase configuration (using default name 'hbaseConfiguration') into the template
<bean id="htemplate" class="org.springframework.data.hadoop.hbase.HbaseTemplate" p:configuration-
ref="hbaseConfiguration"/>
```

The template provides generic callbacks, for executing logic against the tables or doing result or row extraction, but also utility methods (the so-called _one-liner_s) for common operations. Below are some examples of how the template usage looks like:

```
// writing to 'MyTable'
template.execute("MyTable", new TableCallback<Object>() {
   @Override
   public Object doInTable(HTable table) throws Throwable {
      Put p = new Put(Bytes.toBytes("SomeRow"));
      p.add(Bytes.toBytes("SomeColumn"), Bytes.toBytes("SomeQualifier"), Bytes.toBytes("AValue"));
      table.put(p);
      return null;
   }
});
```

```
// read each row from 'MyTable'
List<String> rows = template.find("MyTable", "SomeColumn", new RowMapper<String>() {
    @Override
    public String mapRow(Result result, int rowNum) throws Exception {
        return result.toString();
    }
}));
```

The first snippet showcases the generic TableCallback - the most generic of the callbacks, it does the table lookup and resource cleanup so that the user code does not have to. Notice the callback signature - any exception thrown by the HBase API is automatically caught, converted to Spring's DAO exceptions and resource clean-up applied transparently. The second example, displays the dedicated lookup methods - in this case find which, as the name implies, finds all the rows matching the given criteria and allows user code to be executed against each of them (typically for doing some sort of type conversion or mapping). If the entire result is required, then one can use ResultsExtractor instead of RowMapper.

Besides the template, the package offers support for automatically binding HBase table to the current thread through HbaseInterceptor and HbaseSynchronizationManager. That is, each class that performs DAO operations on HBase can be <u>wrapped</u> by HbaseInterceptor so that each table in use, once found, is bound to the thread so any subsequent call to it avoids the lookup. Once the call ends, the table is automatically closed so there is no leakage between requests. Please refer to the Javadocs for more information.

8. Hive integration

Starting with Spring for Apache Hadoop 2.3 and Hive 1.0 support for HiveServer1 and the Hive Thrift client have been dropped. You should instead use HiveServer2 and the JDBC driver for Hive.

The SHDP programming model for HiveServer1 have been updated to use the JDBC driver instead of directly using the Thrift client. If you have existing code you will have to modify it if you use the HiveTemplate then you should be able to simply update your configuration files to use the JDBC driver.

8.1 Starting a Hive Server

The new HiveServer2 now supports multi-user access and is typically run in the Hadoop cluster. See the Hive Project for details.

8.2 Using the Hive JDBC Client

We provide a dedicated namespace element for configuring a Hive client (that is Hive accessing a server node through JDBC). You also need a hiveDataSource using the JDBC driver for HiveServer2:

8.3 Running a Hive script or query

Like the rest of the Spring Hadoop components, a runner is provided out of the box for executing Hive scripts, either inlined or from various locations through hive-runner element:

The runner will trigger the execution during the application start-up (notice the run-at-startup flag which is by default false). Do note that the runner will not run unless triggered manually or if run-at-startup is set to true. Additionally the runner (as in fact do all runners in SHDP) allows one or multiple pre and post actions to be specified to be executed before and after each run. Typically other runners (such as other jobs or scripts) can be specified but any JDK Callable can be passed in. For more information on runners, see the dedicated chapter.

Using the Hive tasklet

For Spring Batch environments, SHDP provides a dedicated tasklet to execute Hive queries, on demand, as part of a batch or workflow. The declaration is pretty straightforward:

```
<hdp:hive-tasklet id="hive-script">
  <hdp:script>
    DROP TABLE IF EXITS testHiveBatchTable;
    CREATE TABLE testHiveBatchTable (key int, value string);
  </hdp:script>
  <hdp:script location="classpath:org/company/hive/script.q" />
  </hdp:hive-tasklet>
```

The tasklet above executes two scripts - one declared as part of the bean definition followed by another located on the classpath.

8.4 Interacting with the Hive API

For those that need to programmatically interact with the Hive API, Spring for Apache Hadoop provides a dedicated template, similar to the aforementioned JdbcTemplate. The template handles the redundant, boiler-plate code, required for interacting with Hive such as creating a new HiveClient, executing the queries, catching any exceptions and performing clean-up. One can programmatically execute queries (and get the raw results or convert them to longs or ints) or scripts but also interact with the Hive API through the HiveClientCallback. For example:

The example above shows a basic container configuration wiring a <code>HiveTemplate</code> into a user class which uses it to interact with the <code>HiveClient</code> Thrift API. Notice that the user does not have to handle the lifecycle of the <code>HiveClient</code> instance or catch any exception (out of the many thrown by Hive itself and the Thrift fabric) - these are handled automatically by the template which converts them, like the rest of the Spring templates, into `DataAccessException`s. Thus the application only has to track only one exception hierarchy across all data technologies instead of one per technology.

9. Pig support

For <u>Pig</u> users, SHDP provides easy creation and configuration of PigServer instances for registering and executing scripts either locally or remotely. In its simplest form, the declaration looks as follows:

```
<hdp:pig />
```

This will create a org.springframework.data.hadoop.pig.PigServerFactory instance, named pigFactory, a factory that creates PigServer instances on demand configured with a default PigContext, executing scripts in MapReduce mode. The factory is needed since PigServer is not thread-safe and thus cannot be used by multiple objects at the same time. In typical scenarios however, one might want to connect to a remote Hadoop tracker and register some scripts automatically so let us take a look of how the configuration might look like:

The example exposes quite a few options so let us review them one by one. First the top-level pig definition configures the pig instance: the execution type, the Hadoop configuration used and the job name. Notice that additional properties can be specified (either by declaring them inlined or/and loading them from an external file) - in fact, <hdp:pig-factory/> just like the rest of the libraries configuration elements, supports common properties attributes as described in the hadoop configuration section.

The definition contains also two scripts: script.pig (read from the classpath) to which one pair of arguments, relevant to the script, is passed (notice the use of property placeholder) but also an inlined script, declared as part of the definition, without any arguments.

As you can tell, the pig-factory namespace offers several options pertaining to Pig configuration.

9.1 Running a Pig script

Like the rest of the Spring Hadoop components, a runner is provided out of the box for executing Pig scripts, either inlined or from various locations through pig-runner element:

The runner will trigger the execution during the application start-up (notice the run-at-startup flag which is by default false). Do note that the runner will not run unless triggered manually or if run-at-startup is set to true. Additionally the runner (as in fact do all runners in SHDP) allows one or

multiple pre and post actions to be specified to be executed before and after each run. Typically other runners (such as other jobs or scripts) can be specified but any JDK Callable can be passed in. For more information on runners, see the <u>dedicated</u> chapter.

Using the Pig tasklet

For Spring Batch environments, SHDP provides a dedicated tasklet to execute Pig queries, on demand, as part of a batch or workflow. The declaration is pretty straightforward:

```
<hdp:pig-tasklet id="pig-script">
    <hdp:script location="org/company/pig/handsome.pig" />
    </hdp:pig-tasklet>
```

The syntax of the scripts declaration is similar to that of the pig namespace.

9.2 Interacting with the Pig API

For those that need to programmatically interact directly with Pig, Spring for Apache Hadoop provides a dedicated <u>template</u>, similar to the aforementioned <u>HiveTemplate</u>. The template handles the redundant, boiler-plate code, required for interacting with Pig such as creating a new <u>PigServer</u>, executing the scripts, catching any exceptions and performing clean-up. One can programmatically execute scripts but also interact with the Hive API through the <u>PigServerCallback</u>. For example:

```
<hdp:pig-factory ... />
<!-- Pig template wires automatically to 'pigFactory'-->
<hdp:pig-template />
<!-- use component scanning-->
<context:component-scan base-package="some.pkg" />

public class SomeClass {
  @Inject
  private PigTemplate template;

public Set<String> getDbs() {
    return pigTemplate.execute(new PigCallback<Set<String>() {
        @Override
        public Set<String> doInPig(PigServer pig) throws ExecException, IOException {
            return pig.getAliasKeySet();
        }
    });
    });
}
```

The example above shows a basic container configuration wiring a PigTemplate into a user class which uses it to interact with the PigServer API. Notice that the user does not have to handle the lifecycle of the PigServer instance or catch any exception - these are handled automatically by the template which converts them, like the rest of the Spring templates, into `DataAccessException`s. Thus the application only has to track only one exception hierarchy across all data technologies instead of one per technology.

10. Apache Spark integration

Starting with Spring for Apache Hadoop 2.3 we have added a new Spring Batch tasklet for launching Spark jobs in YARN. This support requires access to the Spark Assembly jar that is shipped as part of the Spark distribution. We recommend copying this jar file to a shared location in HDFS. In the example below we chave already copied this jar file to HDFS with the path hdfs:///app/spark/spark-assembly-1.5.0-hadoop2.6.0.jar. You also need your Spark app built and ready to be executed. In the example below we are referencing a pre-built app jar file named spark-hashtags_2.10-0.1.0.jar located in an app directory in our project. The Spark job will be launched using the Spark YARN integration so there is no need to have a separate Spark cluster for this example.

10.1 Simple example for running a Spark YARN Tasklet

The example Spark job will read an input file containing tweets in a JSON format. It will extract and count hashtags and then print the top 10 hashtags found with their counts. This is a very simplified example, but it serves its purpose for this example.

```
/* Hashtags.scala */
import org.apache.spark.SparkContext
import org.apache.spark.SparkConf
import scala.util.parsing.json._
object Hashtags {
      def main(args: Array[String]) {
             val tweetFile = args(0)
             val top10Dir = args(1)
             val conf = new SparkConf().setAppName("Hashtags")
             val sc = new SparkContext(conf)
             val tweetdata = sc.textFile(tweetFile)
              val tweets = tweetdata.map(line => JSON.parseFull(line).get.asInstanceOf[Map[String, Any]])
            val hashTags = tweets.flatMap(map => map.get("text").toString().split("
    ").filter(_.startsWith("#")))
              val hashTagsCounts = hashTags.map((\_, 1)).reduceByKey((a, b) \Rightarrow a + b)
             val \ top10 = hashTagsCounts.map\{case \ (t, c) \ => \ (c, t)\}.sortByKey(false).map\{case \ (c, t) \ => \ (t, c)\}.sortByKey(false).map\{case \ (c, t) \ => \ (c, t)\}.sortByKey(false).map\{case \ (c, 
   c)}.take(10)
              val top10HashTags = sc.parallelize(top10)
             top10HashTags.saveAsTextFile(top10Dir)
             println("Top 10 hashtags:")
             top10.foreach(println)
             sc.stop()
```

We can build this app and package it in a jar file. In this example it is placed in an app directory in our Spring project.

We create a Spring Boot project to host our Java code for this example. The Spring configuration file is the following, first the Hadoop configuration, the application property values and the Job configuration:

```
@Configuration
public class SparkYarnConfiguration {
 @Autowired
 private org.apache.hadoop.conf.Configuration hadoopConfiguration;
 @Value("${example.inputDir}")
 String inputDir;
 @Value("${example.inputFileName}")
 String inputFileName;
 @Value("${example.inputLocalDir}")
 String inputLocalDir;
 @Value("${example.outputDir}")
 String outputDir;
 @Value("${example.sparkAssembly}")
 String sparkAssembly;
 // Job definition
 Job tweetHashtags(JobBuilderFactory jobs, Step initScript, Step sparkTopHashtags) throws Exception {
     return jobs.get("TweetTopHashtags")
         .start(initScript)
         .next(sparkTopHashtags)
         .build();
 }
```

Our batch job consist of two steps. First we run an init script to copy the data file to HDFS using an HdfsScriptRunner:

```
// Step 1 - Init Script
  Step initScript(StepBuilderFactory steps, Tasklet scriptTasklet) throws Exception {
  return steps.get("initScript")
     .tasklet(scriptTasklet)
          .build();
  }
ScriptTasklet scriptTasklet(HdfsScriptRunner scriptRunner) {
 ScriptTasklet scriptTasklet = new ScriptTasklet();
 scriptTasklet.setScriptCallback(scriptRunner);
  return scriptTasklet;
@Bean HdfsScriptRunner scriptRunner() {
 ScriptSource script = new ResourceScriptSource(new ClassPathResource("fileCopy.js"));
  HdfsScriptRunner scriptRunner = new HdfsScriptRunner();
  scriptRunner.setConfiguration(hadoopConfiguration);
  scriptRunner.setLanguage("javascript");
  Map<String, Object> arguments = new HashMap<>();
  arguments.put("source", inputLocalDir);
  arguments.put("file", inputFileName);
  arguments.put("indir", inputDir);
  arguments.put("outdir", outputDir);
  scriptRunner.setArguments(arguments);
  scriptRunner.setScriptSource(script);
  return scriptRunner;
```

The HdfsScriptRunner uses the following JavaScript:

```
if (fsh.test(indir)) {
  fsh.rmr(indir);
}
if (fsh.test(outdir)) {
  fsh.rmr(outdir);
}
fsh.copyFromLocal(source+'/'+file, indir+'/'+file);
```

The second step is to configure and execute the SparkYarnTasklet:

```
// Step 2 - Spark Top Hashtags
    Step sparkTopHashtags(StepBuilderFactory steps, Tasklet sparkTopHashtagsTasklet) throws Exception {
    return steps.get("sparkTopHashtags")
       .tasklet(sparkTopHashtagsTasklet)
           .build();
  SparkYarnTasklet sparkTopHashtagsTasklet() throws Exception {
    SparkYarnTasklet sparkTasklet = new SparkYarnTasklet();
   sparkTasklet.setSparkAssemblyJar(sparkAssembly);
   sparkTasklet.setHadoopConfiguration(hadoopConfiguration);
   sparkTasklet.setAppClass("Hashtags");
   File jarFile = new File(System.getProperty("user.dir") + "/app/spark-hashtags_2.10-0.1.0.jar");
   sparkTasklet.setAppJar(jarFile.toURI().toString());
   sparkTasklet.setExecutorMemory("1G");
   sparkTasklet.setNumExecutors(1);
    sparkTasklet.setArguments(new String[]{
       hadoopConfiguration.get("fs.defaultFS") + inputDir + "/" + inputFileName,
       hadoopConfiguration.get("fs.defaultFS") + outputDir});
   return sparkTasklet;
}
```

For the SparkYarnTasklet, we set the following properties:

- sparkAssembly: the path to the Spark Assembly jar file
- hadoopConfiguration: a refernce of the standard Spring Hadoop Configuration that we are having autowired by Spring Boot
- appClass: the name of the Spark application class, in this case "Hashtags"
- appJar: the path to the Spark application jar file
- executorMemory: the memory for the executoor, "1G" in this example
- numExecutors: the number of Spark executors, we use only 1 for this small example
- arguments: app arguments as a String array, for this app the argument is the HDFS path to the data file

We are now ready to build and run this application example. The Spring Boot driver application is the following:

```
@SpringBootApplication
@EnableBatchProcessing
public class SparkYarnApplication implements CommandLineRunner {

@Autowired
   JobLauncher jobLauncher;

@Autowired
   Job tweetTopHashtags;

public static void main(String[] args) {
       SpringApplication.run(SparkYarnApplication.class, args);
   }

@Override
public void run(String... args) throws Exception {
       System.out.println("RUNNING ...");
       jobLauncher.run(tweetTopHashtags, new JobParametersBuilder().toJobParameters());
   }
}
```

We used the @EnableBatchProcessing annotation to enable the batch features for Spring Boot.

This can now be built using the following Maven POM file:

```
<?xml version="1.0" encoding="UTF-8"?>
xsi:schemaLocation="http://maven.apache.org/POM/4.0.0 http://maven.apache.org/xsd/maven-4.0.0.xsd">
 <modelVersion>4.0.0</modelVersion>
 <groupId>com.springdeveloper.demo</groupId>
 <artifactId>batch-spark</artifactId>
 <version>0.0.1-SNAPSHOT
 <packaging>jar</packaging>
 <name>batch-spark</name>
 <description>Demo project for Spring Batch SparkYarn tasklet</description>
 <parent>
   <groupId>org.springframework.boot</groupId>
   <artifactId>spring-boot-starter-parent</artifactId>
   <version>1.3.1.RELEASE
   <relativePath/> <!-- lookup parent from repository -->
 </parent>
 cproperties>
   project.build.sourceEncoding>UTF-8/project.build.sourceEncoding>
   <java.version>1.7</java.version>
   <spring-data-hadoop.version>2.3.0.RELEASE</spring-data-hadoop.version>
   <spark.version>1.5.0</spark.version>
 </properties>
 <dependencies>
   <dependency>
     <groupId>org.springframework.boot
     <artifactId>spring-boot-starter-batch</artifactId>
     <exclusions>
       <exclusion>
        <groupId>org.springframework.boot</groupId>
         <artifactId>spring-boot-starter-logging</artifactId>
       </exclusion>
     </exclusions>
   </dependency>
   <dependency>
     <groupId>org.springframework.boot
     <artifactId>spring-boot-starter-log4j</artifactId>
   </dependency>
   <dependency>
     <groupId>org.springframework.data
     <artifactId>spring-data-hadoop-boot</artifactId>
     <version>${spring-data-hadoop.version}
   </dependency>
   <dependency>
     <groupId>org.springframework.data
     <artifactId>spring-data-hadoop-batch</artifactId>
     <version>${spring-data-hadoop.version}</version>
   </dependency>
   <dependency>
     <groupId>org.springframework.data
     <artifactId>spring-data-hadoop-spark</artifactId>
     <version>${spring-data-hadoop.version}
   </dependency>
   <dependency>
     <groupId>org.apache.spark</groupId>
     <artifactId>spark-yarn_2.10</artifactId>
     <version>${spark.version}
   </dependency>
 </dependencies>
 <build>
   <plugins>
     <plugin>
      <groupId>org.springframework.boot
       <artifactId>spring-boot-maven-plugin</artifactId>
     </plugin>
   </plugins>
 </build>
</project>
```

We are using the <code>spring-data-hadoop-spark</code> and <code>spring-data-hadoop-batch</code> artifacts for bringing in the batch features we need. We are also using the <code>spring-data-hadoop-boot</code> artifact to enable Boot to autoconfigure our Hadoop configuration.

Application configuration is provided in our application.yml file:

```
spring:
  batch:
    job:
      enabled: false
  hadoop:
    fsUri: hdfs://borneo:8020
    resourceManagerHost: borneo
example:
  inputLocalDir: data
  inputFileName: tweets.dat
  inputDir: /tmp/hashtags/input
  outputDir: /tmp/hashtags/output
  sparkAssembly: hdfs:///app/spark/spark-assembly-1.5.0-hadoop2.6.0.jar
```

We are using configuration settings that work with the SpringOne-2015-Edition Vagrant hadoop installation available here https://github.com/trisberg/hadoop-install.

To build and run this example use

```
mvn clean package
java -jar target/batch-spark-0.0.1-SNAPSHOT.jar
```

11. Using the runner classes

Spring for Apache Hadoop provides for each Hadoop interaction type, whether it is vanilla Map/Reduce, Hive or Pig, a *runner*, a dedicated class used for declarative (or programmatic) interaction. The list below illustrates the existing *runner* classes for each type, their name and namespace element.

Table 11.1. Available Runner s

Туре	Name	Namespace element	Description
Map/Reduce	JobRunner	job-runner	Runner for Map/Reduce jobs, whether vanilla M/R or streaming
Hadoop Tool	ToolRunner	tool- runner	Runner for Hadoop `Tool`s (whether stand-alone or as jars).
Hadoop `jar`s	JarRunner	jar-runner	Runner for Hadoop jars.
Hive queries and scripts	HiveRunner	hive- runner	Runner for executing Hive queries or scripts.
Pig queries and scripts	PigRunner	pig-runner	Runner for executing Pig scripts.
JSR-223/JVM scripts	HdfsScriptR	u nnei pt	Runner for executing JVM 'scripting' languages (implementing the JSR-223 API).

While most of the configuration depends on the underlying type, the runners share common attributes and behaviour so one can use them in a predictive, consistent way. Below is a list of common features:

· declaration does not imply execution

The runner allows a script, a job to run but the execution can be triggered either programmatically or by the container at start-up.

• run-at-startup

Each runner can execute its action at start-up. By default, this flag is set to false. For multiple or on demand execution (such as scheduling) use the Callable contract (see below).

· JDK Callable interface

Each runner implements the JDK Callable interface. Thus one can inject the runner into other beans or its own classes to trigger the execution (as many or as little times as she wants).

pre and post actions

Each runner allows one or multiple, pre or/and post actions to be specified (to chain them together such as executing a job after another or perfoming clean up). Typically other runners can be used but any Callable can be specified. The actions will be executed before and after the main action, in the declaration order. The runner uses a *fail-safe* behaviour meaning, any exception will interrupt the run and will propagated immediately to the caller.

· consider Spring Batch

The runners are meant as a way to execute basic tasks. When multiple executions need to be coordinated and the flow becomes non-trivial, we strongly recommend using Spring Batch which provides all the features of the runners and more (a complete, mature framework for batch execution).

12. Security Support

Spring for Apache Hadoop is aware of the security constraints of the running Hadoop environment and allows its components to be configured as such. For clarity, this document breaks down *security* into HDFS permissions and user impersonation (also known as *secure* Hadoop). The rest of this document discusses each component and the impact (and usage) it has on the various SHDP features.

12.1 HDFS permissions

HDFS layer provides file permissions designed to be similar to those present in *nix OS. The official guide explains the major components but in short, the access for each file (whether it's for reading, writing or in case of directories accessing) can be restricted to certain users or groups. Depending on the user identity (which is typically based on the host operating system), code executing against the Hadoop cluster can see or/and interact with the file-system based on these permissions. Do note that each HDFS or FileSystem implementation can have slightly different semantics or implementation.

SHDP obeys the HDFS permissions, using the identity of the current user (by default) for interacting with the file system. In particular, the HdfsResourceLoader considers when doing pattern matching, only the files that it's supposed to see and does not perform any privileged action. It is possible however to specify a different user, meaning the ResourceLoader interacts with HDFS using that user's rights - however this obeys the #security:kerberos[user impersonation] rules. When using different users, it is recommended to create separate ResourceLoader instances (one per user) instead of assigning additional permissions or groups to one user - this makes it easier to manage and wire the different HDFS views without having to modify the ACLs. Note however that when using impersonation, the ResourceLoader might (and will typically) return restricted files that might not be consumed or seen by the callee.

12.2 User impersonation (Kerberos)

Securing a Hadoop cluster can be a difficult task - each machine can have a different set of users and groups, each with different passwords. Hadoop relies on Kerberos, a ticket-based protocol for allowing nodes to communicate over a non-secure network to prove their identity to one another in a secure manner. Unfortunately there is not a lot of documentation on this topic out there. However there are some resources to get you started.

SHDP does not require any extra configuration - it simply obeys the security system in place. By default, when running inside a *secure* Hadoop, SHDP uses the current user (as expected). It also supports *user impersonation*, that is, interacting with the Hadoop cluster with a different identity (this allows a superuser to submit job or access hdfs on behalf of another user in a secure way, without *leaking* permissions). The major MapReduce components, such as <code>job</code>, <code>streaming</code> and <code>tool</code> as well as <code>pig</code> support user impersonation through the <code>user</code> attribute. By default, this property is empty, meaning the current user is used - however one can specify the different identity (also known as *ugi*) to be used by the target component:

```
<hdp:job id="jobFromJoe" user="joe" .../>
```

Note that the user running the application (or the current user) must have the proper kerberos credentials to be able to impersonate the target user (in this case *joe*).

12.3 Boot Support

spring.hadoop.security configuration properties

Namespace spring.hadoop.security supports following properties; <u>authMethod</u>, <u>userPrincipal</u>, <u>userKeytab</u>, <u>namenodePrincipal</u> and <u>rmManagerPrincipal</u>.

```
spring.hadoop.security.authMethod
```

Description

Defines a used Hadoop security authentication method. Currently if set only value KERBEROS is supported.

Required

No

Type

String

Default Value

null

spring.hadoop.security.userPrincipal

Description

Defines a used Hadoop kerberos user principal.

Required

No

Туре

String

Default Value

null

spring.hadoop.security.userKeytab

Description

Defines a used Spring Hadoop user facing kerberos keytab file path. This needs to be a fully qualified path to a file existing on a local file system. Due to restrictions in jvm's kerberos implementation, relative paths or resolving from a classpath are not supported.

Required

No

Type

String

Default Value

null

spring.hadoop.security.namenodePrincipal

Description

Defines a used Hadoop kerberos namenode principal.

Required No

Type

String

Default Value

null

spring.hadoop.security.rmManagerPrincipal

Description

Defines a used Hadoop kerberos resource manager principal.

Required

No

Type

String

Default Value

null

13. Yarn Support

You've propbably seen a lot of topics around Yarn and next version of Hadoop's Map Reduce called *MapReduce Version 2*. Originally Yarn was a component of MapReduce itself created to overcome some performance issues in Hadoop's original design. The fundamental idea of MapReduce v2 is to split up the two major functionalities of the JobTracker, resource management and job scheduling/monitoring, into separate daemons. The idea is to have a global *Resource Manager* (RM) and per-application *Application Master* (AM). An application is either a single job in the classical sense of Map-Reduce jobs or a group of jobs.

Let's take a step back and see how original *MapReduce Version 1* works. *Job Tracker* is a global singleton entity responsible for managing resources like per node *Task Trackers* and job life-cycle. *Task Tracker* is responsible for executing tasks from a *Job Tracker* and periodically reporting back the status of the tasks. Naturally there is a much more going on behind the scenes but the main point of this is that the *Job Tracker* has always been a bottleneck in terms of scalability. This is where Yarn steps in by splitting the load away from a global resource management and job tracking into per application masters. Global resource manager can then concentrate in its main task of handling the management of resources.

Note

Yarn is usually referred as a synonym for MapReduce Version 2. This is not exactly true and it's easier to understand the relationship between those two by saying that MapReduce Version 2 is an application running on top of Yarn.

As we just mentioned *MapReduce Version 2* is an application running of top of *Yarn*. It is possible to make similar custom *Yarn* based application which have nothing to do with *MapReduce*. *Yarn* itself doesn't know that it is running *MapReduce Version 2*. While there's nothing wrong to do everything from scratch one will soon realise that steps to learn how to work with *Yarn* are rather deep. This is where Spring Hadoop support for Yarn steps in by trying to make things easier so that user could concentrate on his own code and not having to worry about framework internals.

13.1 Using the Spring for Apache Yarn Namespace

To simplify configuration, SHDP provides a dedicated namespace for *Yarn* components. However, one can opt to configure the beans directly through the usual <bean> definition. For more information about XML Schema-based configuration in Spring, see this appendix in the Spring Framework reference documentation.

To use the SHDP namespace, one just needs to import it inside the configuration:

```
<?xml version="1.0" encoding="UTF-8"?>
<beans xmlns="http://www.springframework.org/schema/beans"</pre>
 xmlns:xsi="http://www.w3.org/2001/XMLSchema-instance"
 xmlns:yarn="http://www.springframework.org/schema/yarn"00
 xmlns:yarn-int="http://www.springframework.org/schema/yarn/integration" 80
 xmlns:yarn-batch="http://www.springframework.org/schema/yarn/batch"60
 xsi:schemaLocation="
   http://www.springframework.org/schema/beans
   http://www.springframework.org/schema/beans/spring-beans.xsd
   http://www.springframework.org/schema/yarn
   http://www.springframework.org/schema/yarn/spring-yarn.xsd@
   http://www.springframework.org/schema/yarn/integration
   http://www.springframework.org/schema/yarn/integration/spring-yarn-integration.xsd
   http://www.springframework.org/schema/yarn/batch
   http://www.springframework.org/schema/yarn/batch/spring-yarn-batch.xsd">9
 <bean id ... >
 <varn:configuration ...>@
</beans>
```

- Spring for Apache Hadoop Yarn namespace prefix for core package. Any name can do but through out the reference documentation, the yarn will be used.
- The namespace URI.
- Spring for Apache Hadoop Yarn namespace prefix for integration package. Any name can do but through out the reference documentation, the yarn-int will be used.
- The namespace URI.
- Spring for Apache Hadoop Yarn namespace prefix for batch package. Any name can do but through out the reference documentation, the yarn-batch will be used.
- The namespace URI.
- The namespace URI location. Note that even though the location points to an external address (which exists and is valid), Spring will resolve the schema locally as it is included in the Spring for Apache Hadoop Yarn library.
- The namespace URI location.
- The namespace URI location.
- Declaration example for the Yarn namespace. Notice the prefix usage.

Once declared, the namespace elements can be declared simply by appending the aforementioned prefix. Note that is possible to change the default namespace, for example from <beans> to <yarn>. This is useful for configuration composed mainly of Hadoop components as it avoids declaring the prefix. To achieve this, simply swap the namespace prefix declaration above:

```
<?xml version="1.0" encoding="UTF-8"?>
<beans:beans
xmlns="http://www.springframework.org/schema/yarn"
xmlns:xsi="http://www.w3.org/2001/XMLSchema-instance"
xmlns:beans="http://www.springframework.org/schema/beans"
xsi:schemaLocation="
http://www.springframework.org/schema/beans
http://www.springframework.org/schema/beans/spring-beans.xsd
http://www.springframework.org/schema/yarn
http://www.springframework.org/schema/yarn
http://www.springframework.org/schema/yarn/spring-yarn.xsd">
<beans:bean id ... > 6
</beans:beans></beans></beans></beans></beans></beans></beans>
```

- The default namespace declaration for this XML file points to the Spring for Apache Yarn namespace.
- 2 The beans namespace prefix declaration.
- Bean declaration using the <beans> namespace. Notice the prefix.
- Bean declaration using the <yarn> namespace. Notice the lack of prefix (as yarn is the default namespace).

13.2 Using the Spring for Apache Yarn JavaConfig

It is also possible to work without XML configuration and rely on Annotation based configuration model. XML and JavaConfig for *Spring YARN* are not full replacement for each others but we try to mimic the behaviour as much as we can.

We basically rely on two concepts when working with JavaConfig. Firstly an annotation @EnableYarn is used to activate different parts of a Spring Configuration depending on *enable* attribute. We can enable configuration for *CONTAINER*, *APPMASTER* or *CLIENT*. Secondly when configuration is enabled one can use SpringYarnConfigurerAdapter whose callback methods can be used to do further configuration for components familiar from XML.

In above example we enabled configuration for *CONTAINER* and used SpringYarnConfigurerAdapter and its configure callback method for YarnContainerConfigurer. In this method we instructed container class to be a MultiContextContainer.

```
@Configuration
@EnableYarn(enable=Enable.APPMASTER)
public class AppmasterConfiguration extends SpringYarnConfigurerAdapter {
    @Override
    public void configure(YarnAppmasterConfigurer master) throws Exception {
        master
            .withContainerRunner();
    }
}
```

In above example we enabled configuration for *APPMASTER* and because of this a callback method for YarnAppmasterConfigurer is called automatically.

```
@Configuration
@EnableYarn(enable=Enable.CLIENT)
@PropertySource("classpath:hadoop.properties")
public class ClientConfiguration extends SpringYarnConfigurerAdapter {
 @Autowired
 private Environment env;
  @Override
 public void configure(YarnConfigConfigurer config) throws Exception {
      .fileSystemUri(env.getProperty("hd.fs"))
      .resourceManagerAddress(env.getProperty("hd.rm"));
 @Override
 public void configure(YarnClientConfigurer client) throws Exception {
   Properties arguments = new Properties();
   arguments.put("container-count", "4");
   client
     .appName("multi-context-jc")
     .withMasterRunner()
       .contextClass(AppmasterConfiguration.class)
       .arguments(arguments);
}
```

In above example we enabled configuration for *CLIENT*. Here one will get yet another callback for YarnClientConfigurer. Additionally this shows how a Hadoop configuration can be customized using a callback for YarnConfigConfigurer.

13.3 Configuring Yarn

In order to use Hadoop and Yarn, one needs to first configure it namely by creating a YarnConfiguration object. The configuration holds information about the various parameters of the Yarn system.

Note

Configuration for configuration looks very similar than <hdp:configuration</pre>.
Reason for this is a simple separation for Hadoop's YarnConfiguration and JobConf classes.

In its simplest form, the configuration definition is a one liner:

```
<yarn:configuration />
```

The declaration above defines a YarnConfiguration bean (to be precise a factory bean of type ConfigurationFactoryBean) named, by default, yarnConfiguration. The default name is used, by conventions, by the other elements that require a configuration - this leads to simple and very concise configurations as the main components can automatically wire themselves up without requiring any specific configuration.

For scenarios where the defaults need to be tweaked, one can pass in additional configuration files:

```
<yarn:configuration resources="classpath:/custom-site.xml, classpath:/hq-site.xml">
```

In this example, two additional Hadoop configuration resources are added to the configuration.

Note

Note that the configuration makes use of Spring's Resource abstraction to locate the file. This allows various search patterns to be used, depending on the running environment or the prefix specified(if any) by the value - in this example the classpath is used.

In addition to referencing configuration resources, one can tweak Hadoop settings directly through Java Properties. This can be quite handy when just a few options need to be changed:

```
<?xml version="1.0" encoding="UTF-8"?>
<beans xmlns="http://www.springframework.org/schema/beans"
    xmlns:xsi="http://www.w3.org/2001/XMLSchema-instance"
    xmlns:yarn="http://www.springframework.org/schema/yarn"
    xsi:schemaLocation="http://www.springframework.org/schema/beans http://www.springframework.org/schema/
beans/spring-beans.xsd
    http://www.springframework.org/schema/yarn http://www.springframework.org/schema/yarn/spring-
yarn.xsd">

</pr
```

One can further customize the settings by avoiding the so called *hard-coded* values by externalizing them so they can be replaced at runtime, based on the existing environment without touching the configuration:

```
<?xml version="1.0" encoding="UTF-8"?>
<beans xmlns="http://www.springframework.org/schema/beans"</pre>
 xmlns:xsi="http://www.w3.org/2001/XMLSchema-instance
 xmlns:yarn="http://www.springframework.org/schema/yarn"
 xmlns:context="http://www.springframework.org/schema/context"
 xsi:schemaLocation="http://www.springframework.org/schema/beans http://www.springframework.org/schema/
beans/spring-beans.xsd
   http://www.springframework.org/schema/context http://www.springframework.org/schema/context/spring-
context.xsd
   http://www.springframework.org/schema/yarn http://www.springframework.org/schema/yarn/spring-
yarn.xsd">
  <yarn:configuration>
   fs.defaultFS=${hd.fs}
   hadoop.tmp.dir=file://${java.io.tmpdir}
   hangar=${number:18}
 </yarn:configuration>
  <context:property-placeholder location="classpath:hadoop.properties" />
</beans>
```

Through Spring's property placeholder <u>support</u>, <u>SpEL</u> and the <u>environment abstraction</u>. one can externalize environment specific properties from the main code base easing the deployment across multiple machines. In the example above, the default file system is replaced based on the properties available in hadoop.properties while the temp dir is determined dynamically through SpEL. Both approaches offer a lot of flexbility in adapting to the running environment - in fact we use this approach extensivly in the Spring for Apache Hadoop test suite to cope with the differences between the different development boxes and the CI server.

Additionally, external Properties files can be loaded, Properties beans (typically declared through Spring's ``namespace). Along with the nested properties declaration, this allows customized configurations to be easily declared:

```
<?xml version="1.0" encoding="UTF-8"?>
<beans xmlns="http://www.springframework.org/schema/beans"</pre>
 xmlns:xsi="http://www.w3.org/2001/XMLSchema-instance"
 xmlns:yarn="http://www.springframework.org/schema/yarn"
 xmlns:context="http://www.springframework.org/schema/context"
 xmlns:util="http://www.springframework.org/schema/util"
 xsi:schemaLocation="http://www.springframework.org/schema/beans http://www.springframework.org/schema/
beans/spring-beans.xsd
   http://www.springframework.org/schema/context http://www.springframework.org/schema/context/spring-
   http://www.springframework.org/schema/util http://www.springframework.org/schema/util/spring-
util.xsd
   http://www.springframework.org/schema/yarn http://www.springframework.org/schema/yarn/spring-
varn.xsd">
 <!-- merge the local properties, the props bean and the two properties files -->
 <yarn:configuration properties-ref="props" properties-location="cfg-1.properties, cfg-2.properties">
   star=chasing
   captain=eo
 </yarn:configuration>
 <util:properties id="props" location="props.properties"/>
```

When merging several properties, ones defined locally win. In the example above the configuration properties are the primary source, followed by the props bean followed by the external properties file based on their defined order. While it's not typical for a configuration to refer to use so many properties, the example showcases the various options available.

Note

For more properties utilities, including using the System as a source or fallback, or control over the merging order, consider using Spring's PropertiesFactoryBean (which is what Spring for Apache Hadoop Yarn and util:properties use underneath).

It is possible to create configuration based on existing ones - this allows one to create dedicated configurations, slightly different from the main ones, usable for certain jobs (such as streaming - more on that #yarn:job:streaming[below]). Simply use the configuration-ref attribute to refer to the parent configuration - all its properties will be inherited and overridden as specified by the child:

```
<!-- default name is 'yarnConfiguration' -->
<yarn:configuration>
fs.defaultFS=${hd.fs}
hadoop.tmp.dir=file://${java.io.tmpdir}
</yarn:configuration>
<yarn:configuration id="custom" configuration-ref="yarnConfiguration">
fs.defaultFS=${custom.hd.fs}
</yarn:configuration>
...
```

Make sure though you specify a different name since otherwise, since both definitions will have the same name, the Spring container will interpret this as being the same definition (and will usually consider the last one found).

Last but not least a reminder that one can mix and match all these options to her preference. In general, consider externalizing configuration since it allows easier updates without interfering with the application configuration. When dealing with multiple, similar configuration use configuration *composition* as it tends to keep the definitions concise, in sync and easy to update.

Table 13.1. yarn: configuration attributes

Name	Values	Description
configuration ref	-Bean Reference	Reference to existing Configuration bean
properties- ref	Bean Reference	Reference to existing <i>Properties</i> bean
properties- location	Comma delimited list	List or Spring Resource paths
resources	Comma delimited list	List or Spring Resource paths
fs-uri	String	The HDFS filesystem address. Equivalent to <i>fs.defaultFS</i> property.
rm-address	String	The Yarn Resource manager address. Equivalent to yarn.resourcemanager.address property.
scheduler- address	String	The Yarn Resource manager scheduler address. Equivalent to yarn.resourcemanager.scheduler.address property.

13.4 Local Resources

When *Application Master* or any other *Container* is run in a hadoop cluster, there are usually dependencies to various application and configuration files. These files needs to be localized into a running *Container* by making a physical copy. Localization is a process where dependent files are copied into node's directory structure and thus can be used within the *Container* itself. Yarn itself tries to provide isolation in a way that multiple containers and applications would not clash.

In order to use local resources, one needs to create an implementation of ResourceLocalizer interface. In its simplest form, resource localizer can be defined as:

```
<yarn:localresources>
  <yarn:hdfs path="/path/in/hdfs/my.jar"/>
</yarn:localresources>
```

The declaration above defines a ResourceLocalizer bean (to be precise a factory bean of type LocalResourcesFactoryBean) named, by default, *yarnLocalresources*. The default name is used, by conventions, by the other elements that require a reference to a resource localizer. It's explained later how this reference is used when container launch context is defined.

It is also possible to define path as pattern. This makes it easier to pick up all or subset of files from a directory.

```
<yarn:localresources>
  <yarn:hdfs path="/path/in/hdfs/*.jar"/>
</yarn:localresources>
```

Behind the scenes it's not enough to simple have a reference to file in a hdfs file system. Yarn itself when localizing resources into container needs to do a consistency check for copied files. This is done by checking file size and timestamp. This information needs to passed to yarn together with a file path.

Order to do this the one who defines these beans needs to ask this information from hdfs prior to sending out resouce localizer request. This kind of behaviour exists to make sure that once localization is defined, *Container* will fail fast if dependant files were replaced during the process.

On default the hdfs base address is coming from a Yarn configuration and ResourceLocalizer bean will use configuration named *yarnLocalresources*. If there is a need to use something else than the default bean, *configuration* parameter can be used to make a reference to other defined configurations.

```
<yarn:localresources configuration="yarnConfiguration">
    <yarn:hdfs path="/path/in/hdfs/my.jar"/>
    </yarn:localresources>
```

For example, client defining a launch context for *Application Master* needs to access dependent hdfs entries. Effectively hdfs entry given to resource localizer needs to be accessed from a *Node Manager*.

Yarn resource localizer is using additional parameters to define entry type and visibility. Usage is described below:

```
<yarn:localresources>
  <yarn:hdfs path="/path/in/hdfs/my.jar" type="FILE" visibility="APPLICATION"/>
</yarn:localresources>
```

For convenience it is possible to copy files into hdfs during the localization process using a *yarn:copy* tag. Currently base staging directory is */syarn/staging/xx* where *xx* is a unique identifier per application instance.

```
<yarn:localresources>
  <yarn:copy src="file:/local/path/to/files/*jar" staging="true"/>
  <yarn:hdfs path="/*" staging="true"/>
  </yarn:localresources>
```

Table 13.2. yarn: localresources attributes

Name	Values	Description
configuration	Bean Reference	A reference to configuration bean name, default is yarnConfiguration
type	ARCHIVE, FILE, PATTERN	Global default if not defined in entry level
visibility	PUBLIC, PRIVATE, APPLICATION	Global default if not defined in entry level

Table 13.3. yarn: hdfs attributes

Name	Values	Description
path	HDFS Path	Path in hdfs
type	ARCHIVE, FILE(default), PATTERN	ARCHIVE - automatically unarchived by the Node Manager, FILE - regular file, PATTERN - hybrid between archive and file.

Name	Values	Description
visibility	PUBLIC, PRIVATE, APPLICATION	PUBLIC - Shared by all users on the node, PRIVATE - Shared among all applications of the same user on the node, (chefault)CATION - Shared only among containers of the same application on the node
staging	true, false(default)	Internal temporary stagind directory.

Table 13.4. yarn: copy attributes

Name	Values	Description
src	Copy sources	Comma delimited list of resource patterns
staging	true, false(default)	Internal temporary stagind directory.

13.5 Container Environment

One central concept in Yarn is to use environment variables which then can be read from a container. While it's possible to read those variable at any time it is considered bad design if one chooce to do so. Spring Yarn will pass variable into application before any business methods are executed, which makes things more clearly and testing becomes much more easier.

```
<yarn:environment/>
```

The declaration above defines a Map bean (to be precise a factory bean of type EnvironmentFactoryBean) named, by default, *yarnEnvironment*. The default name is used, by conventions, by the other elements that require a reference to a environment variables.

For convenience it is possible to define a classpath entry directly into an environment. Most likely one is about to run some java code with libraries so classpath needs to be defined anyway.

If use-yarn-app-classpath parameter is set to true(default value) a default yarn entries will be added to classpath automatically. These entries are on default resolved from a normal Hadoop Yarn Configuration using its yarn.application.classpath property or if site-yarn-app-classpath has a any content entries are resolved from there.

Note

Be carefull if passing environment variables between different systems. For example if running a client on Windows and passing variables to Application Master running on Linux, execution wrapper in Yarn may silently fail.

Table 13.5. yarn:environment attributes

Name	Values	Description
include- local- system-env	true, false(default)	Defines whether system environment variables are actually added to this bean.

Table 13.6. classpath attributes

Name	Values	Description
use- yarn-app- classpath	false(default)	, Defines whether default yarn entries are added to classpath.
use- mapreduce- app- classpath	false(default)	, Defines whether default mr entries are added to classpath.
site- yarn-app- classpath	Classpath entries	Defines a comma delimited list of default yarn application classpath entries.
site- mapreduce- app- classpath	Classpath entries	Defines a comma delimited list of default mr application classpath entries.
delimiter	Delimiter string, default is ":"	Defines delimiter used in a classpath string

13.6 Application Client

Client is always your entry point when interacting with a Yarn system whether one is about to submit a new application instance or just querying *Resource Manager* for running application(s) status. Currently support for client is very limited and a simple command to start *Application Master* can be defined. If there is just a need to query *Resource Manager*, command definition is not needed.

The declaration above defines a YarnClient bean (to be precise a factory bean of type YarnClientFactoryBean) named, by default, yarnClient. It also defines a command launching an

Application Master using <master-command> entry which is also a way to define the raw commands. If this yarnClient instance is used to submit an application, its name would come from a app-name attribute.

```
<yarn:client app-name="customAppName">
    <yarn:master-runner/>
</yarn:client>
```

For a convinience entry <master-runner> can be used to define same command entries.

```
<yarn:client app-name="customAppName">
    <util:properties id="customArguments">
        container-count=2
    </util:properties>
    <yarn:master-runner
        command="java"
        context-file="appmaster-context.xml"
        bean-name="yarnAppmaster"
        arguments="customArguments"
        stdout="<LOG_DIR>/AppMaster.stdout"
        stderr="<LOG_DIR>/AppMaster.stderr" />
</yarn:client>
```

All previous three examples are effectively identical from Spring Yarn point of view.

Note

The <LOG_DIR> refers to Hadoop's dedicated log directory for the running container.

```
<yarn:client app-name="customAppName"
  configuration="customConfiguration"
  resource-localizer="customResources"
  environment="customEnv"
  priority="1"
  virtualcores="2"
  memory="11"
  queue="customqueue">
    <yarn:master-runner/>
  </yarn:client>
```

If there is a need to change some of the parameters for the *Application Master* submission, memory and virtualcores defines the container settings. For submission, queue and priority defines how submission is actually done.

Table 13.7. yarn:client attributes

Name	Values	Description
app-name	Name as string, default is empty	Yarn submitted application name
configuration	Bean Reference	A reference to configuration bean name, default is yarnConfiguration
resource- localizer	Bean Reference	A reference to resource localizer bean name, default is yarnLocalresources
environment	Bean Reference	A reference to environment bean name, default is yarnEnvironment

Name	Values	Description
template	Bean Reference	A reference to a bean implementing ClientRmOperations
memory	Memory as integer, default is "64"	Amount of memory for appmaster resource
virtualcores	Cores as integer, default is "1"	Number of appmaster resource virtual cores
priority	Priority as integer, default is "0"	Submission priority
queue	Queue string, default is "default"	Submission queue

Table 13.8. yarn: master-command

Name	Values	Description
Entry content	List of commands	Commands defined in this entry are aggregated into a single command line

Table 13.9. yarn: master-runner attributes

Name	Values	Description
command	Main command as string, default is "java"	Command line first entry
context-file	Name of the Spring context file, default is "appmaster- context.xml"	Command line second entry
bean-name	Name of the Spring bean, default is "yarnAppmaste	Command line third entry
arguments	Reference to Java's Properties	Added to command line parameters as key/value pairs separated by '='
stdout	Stdout, default is	Appended with 1>

Name	Values	Description
	" <log_dir>/ AppMaster.stdo</log_dir>	out"
stderr	Stderr, default is " <log_dir>/ AppMaster.stde</log_dir>	Appended with 2> err"

13.7 Application Master

Application master is responsible for container allocation, launching and monitoring.

The declaration above defines a YarnAppmaster bean (to be precise a bean of type StaticAppmaster) named, by default, *yarnAppmaster*. It also defines a command launching a *Container(s)* using <container-command> entry, parameters for allocation using <container-allocator> entry and finally a launcher parameter using <container-launcher> entry.

Currently there is a simple implementation of StaticAppmaster which is able to allocate and launch a number of containers. These containers are monitored by querying resource manager for container execution completion.

```
<yarn:master>
  <yarn:container-runner/>
</yarn:master>
```

For a convinience entry <container-runner> can be used to define same command entries.

```
<yarn:master>
  <util:properties id="customArguments">
    some-argument=myvalue
  </util:properties>
  <yarn:container-runner
    command="java"
    context-file="container-context.xml"
    bean-name="yarnContainer"
    arguments="customArguments"
    stdout="clog_DIR>/Container.stdout"
    stderr="clog_DIR>/Container.stderr" />
  </yarn:master>
```

Table 13.10. yarn:master attributes

Name	Values	Description
configuration	Bean Reference	A reference to configuration bean name, default is yarnConfiguration
resource- localizer	Bean Reference	A reference to resource localizer bean name, default is yarnLocalresources
environment	Bean Reference	A reference to environment bean name, default is yarnEnvironment

Table 13.11. yarn:container-allocator attributes

Name	Values	Description
virtualcores	Integer	number of virtual cpu cores of the resource.
memory	Integer, as of MBs.	memory of the resource.
priority	Integer	Assigned priority of a request.
locality	Boolean	If set to true indicates that resources are not relaxed. Default is <i>FALSE</i> .

Table 13.12. yarn:container-launcher attributes

Name	Values	Description
username	String	Set the <i>user</i> to whom the container has been allocated.

Table 13.13. yarn: container-runner attributes

Name	Values	Description
command	Main command as string, default is "java"	Command line first entry
context-file	Name of the Spring context file, default is "container- context.xml"	Command line second entry
bean-name	Name of the Spring bean, default is "yarnContainer"	Command line third entry
arguments	Reference to Java's Properties	Added to command line parameters as key/value pairs separated by '='

Name	Values	Description
stdout	Stdout, default is " <log_dir>/ Container.stdou</log_dir>	Appended with 1>
stderr	Stderr, default is " <log_dir>/ Container.stder</log_dir>	Appended with 2>

13.8 Application Container

There very little what Spring Yarn needs to know about configuration. Container is a in terms of its There simple contract between org.springframework.yarn.container.CommandLineContainerRunner and a bean it's trying to run on default. Default bean name is yarnContainer.

There is a simple interface org.springframework.yarn.container.YarnContainer which container needs to implement.

```
public interface YarnContainer {
  void run();
  void setEnvironment(Map<String, String> environment);
  void setParameters(Properties parameters);
}
```

There are few different ways how Container can be defined in Spring xml configuration. Natively without using namespaces bean can be defined with a correct name:

```
<bean id="yarnContainer" class="org.springframework.yarn.container.TestContainer">
```

Spring Yarn namespace will make it even more simpler. Below example just defines class which implements needed interface.

```
<yarn:container container-class="org.springframework.yarn.container.TestContainer"/>
```

It's possible to make a reference to existing bean. This is usefull if bean cannot be instantiated with default constructor.

```
<bean id="testContainer" class="org.springframework.yarn.container.TestContainer"/>
<yarn:container container-ref="testContainer"/>
```

It's also possible to inline the bean definition.

```
<yarn:container>
  <bean class="org.springframework.yarn.container.TestContainer"/>
</yarn:container>
```

13.9 Application Master Services

It is fairly easy to create an application which launches a few containers and then leave those to do their tasks. This is pretty much what *Distributed Shell* example application in Yarn is doing. In that example a container is configured to run a simple shell command and *Application Master* only tracks

when containers have finished. If only need from a framework is to be able to fire and forget then that's all you need, but most likely a real-world Yarn application will need some sort of collaboration with *Application Master*. This communication is initiated either from *Application Client* or *Application Container*.

Yarn framework itself doesn't define any kind of general communication API for *Application Master*. There are APIs for communicating with *Container Manager* and *Resource Manager* which are used on within a layer not necessarily exposed to a user. Spring Yarn defines a general framework to talk to *Application Master* through an abstraction and currently a JSON based rpc system exists.

This chapter concentrates on developer concepts to create a custom services for *Application Master*, configuration options for built-in services can be found from sections below - #yarn:masterservice[Appmaster Service] and #yarn:masterserviceclient[Appmaster Service Client].

Basic Concepts

Having a communication framework between *Application Master* and *Container/Client* involves few moving parts. Firstly there has to be some sort of service running on an *Application Master*. Secondly user of this service needs to know where it is and how to connect to it. Thirtly, if not creating these services from scratch, it'd be nice if some sort of abstraction already exist.

Contract for appmaster service is very simple, *Application Master Service* needs to implement AppmasterService interface be registered with Spring application context. Actual appmaster instance will then pick it up from a bean factory.

```
public interface AppmasterService {
  int getPort();
  boolean hasPort();
  String getHost();
}
```

Application Master Service framework currently provides integration for services acting as service for a Client or a Container. Only difference between these two roles is how the Service Client gets notified about the address of the service. For the Client this information is stored within the Hadoop Yarn resource manager. For the Container this information is passed via environment within the launch context.

```
<bean id="yarnAmservice" class="AppmasterServiceImpl" />
<bean id="yarnClientAmservice" class="AppmasterClientServiceImpl" />
```

Example above shows a default bean names, *yarnAmservice* and *yarnClientAmservice* respectively recognised by Spring Yarn.

Interface AppmasterServiceClient is currently an empty interface just marking class to be a appmaster service client.

```
public interface AppmasterServiceClient {
}
```

Using JSON

Default implementations can be used to exchange messages using a simple domain classes and actual messages are converted into json and send over the transport.

Converters

When default implementations for Application master services are exchanging messages, converters are net registered automatically. There is a namespace tag *converters* to ease this configuration.

13.10 Application Master Service

This section of this document is about configuration, more about general concepts for see a?.

Currently Spring Yarn have support for services using Spring Integration top channels as a transport.

If there is a need to manually configure the server side dispatch channel, a little bit more configuration is needed.

```
<bean id="serializer"</pre>
  class="org.springframework.yarn.integration.ip.mind.MindRpcSerializer" />
<bean id="deserializer"</pre>
 class="org.springframework.yarn.integration.ip.mind.MindRpcSerializer" />
<bean id="socketSupport"</pre>
 class="org.springframework.yarn.integration.support.DefaultPortExposingTcpSocketSupport" />
<ip:tcp-connection-factory id="serverConnectionFactory"</pre>
 type="server"
  socket-support="socketSupport"
 serializer="serializer"
 deserializer="deserializer"/>
<ip:tcp-inbound-gateway id="inboundGateway"</pre>
 connection-factory="serverConnectionFactory"
 request-channel="serverChannel" />
<int:channel id="serverChannel" />
<yarn-int:amservice</pre>
  service-impl="org.springframework.yarn.integration.ip.mind.TestService"
  channel="serverChannel"
  socket-support="socketSupport"/>
```

Table 13.14. yarn-int:amservice attributes

Name	Values	Description
service-impl	Class Name	Full name of the class implementing a service
service-ref	Bean Reference	Reference to a bean name implementing a service
channel	Spring Int channel	Custom message dispatching channel
socket- support	Socket support reference	Custom socket support class

13.11 Application Master Service Client

This section of this document is about configuration, more about general concepts for see a ?.

Currently Spring Yarn have support for services using Spring Integration tcp channels as a transport.

```
<bean id="mapper"</pre>
 class="org.springframework.yarn.integration.support.Jackson2ObjectMapperFactoryBean" />
<yarn-int:converter>
 <bean class="org.springframework.yarn.integration.convert.MindObjectToHolderConverter">
   <constructor-arg ref="mapper"/>
</yarn-int:converter>
<varn-int:converter>
 <bean class="org.springframework.yarn.integration.convert.MindHolderToObjectConverter">
   <constructor-arg ref="mapper"/>
    <constructor-arg value="org.springframework.yarn.integration.ip.mind"/>
 </bean>
</yarn-int:converter>
<yarn-int:amservice-client</pre>
 {\tt service-impl="org.springframework.yarn.integration.ip.mind.Default{\tt MindAppmasterServiceClient"}}
 host="${SHDP_AMSERVICE_HOST}"
 port="${SHDP_AMSERVICE_PORT}"/>
```

If there is a need to manually configure the server side dispatch channel, a little bit more configuration is needed.

```
<bean id="serializer"</pre>
  class="org.springframework.yarn.integration.ip.mind.MindRpcSerializer" />
<bean id="deserializer"</pre>
 class="org.springframework.yarn.integration.ip.mind.MindRpcSerializer" />
<ip:tcp-connection-factory id="clientConnectionFactory"</pre>
  type="client"
 host="localhost"
 port="${SHDP_AMSERVICE_PORT}"
  serializer="serializer"
  deserializer="deserializer"/>
<ip:tcp-outbound-gateway id="outboundGateway"</pre>
 connection-factory="clientConnectionFactory"
  request-channel="clientRequestChannel"
 reply-channel="clientResponseChannel" />
<int:channel id="clientRequestChannel" />
<int:channel id="clientResponseChannel" >
 <int:queue />
</int:channel>
<yarn-int:amservice-client</pre>
 {\tt service-impl="org.springframework.yarn.integration.ip.mind.DefaultMindAppmasterServiceClient"}
  request-channel="clientRequestChannel"
  response-channel="clientResponseChannel"/>
```

Table 13.15. yarn-int:amservice-client attributes

Name	Values	Description
service-impl	Class Name	Full name of the class implementing a service client
host	Hostname	Host of the running appmaster service
port	Port	Port of the running appmaster service
request- channel	Reference to Spring Int request channel	Custom channel

Name	Values	Description
response- channel	Reference to Spring Int response channel	Custom channel

13.12 Using Spring Batch

In this chapter we assume you are fairly familiar with concepts using *Spring Batch*. Many batch processing problems can be solved with single threaded, single process jobs, so it is always a good idea to properly check if that meets your needs before thinking about more complex implementations. When you are ready to start implementing a job with some parallel processing, Spring Batch offers a range of options. At a high level there are two modes of parallel processing: single process, multi-threaded; and multi-process.

Spring Hadoop contains a support for running Spring Batch jobs on a Hadoop cluster. For better parallel processing Spring Batch partitioned steps can be executed on a Hadoop cluster as remote steps.

Batch Jobs

Starting point running a *Spring Batch Job* is always the *Application Master* whether a job is just simple job with or without partitioning. In case partitioning is not used the whole job would be run within the *Application Master* and no *Containers* would be launched. This may seem a bit odd to run something on Hadoop without using *Containers* but one should remember that *Application Master* is also just a resource allocated from a Hadoop cluster.

Order to run Spring Batch jobs on a Hadoop cluster, few constraints exists:

- Job Context Application Master is the main entry point of running the job.
- Job Repository Application Master needs to have access to a repository which is located either inmemory or in a database. These are the two type natively supported by Spring Batch.
- Remote Steps Due to nature how Spring Batch partitioning works, remote step needs an access
 to a job repository.

Configuration for Spring Batch Jobs is very similar what is needed for normal batch configuration because effectively that's what we are doing. Only difference is a way a job is launched which in this case is automatically handled by *Application Master*. Implementation of a job launching logic is very similar compared to CommandLineJobRunner found from a Spring Batch.

The declaration above define beans for JobRepository and JobLauncher. For simplisity we used inmemory repository while it would be possible to switch into repository working with a database if persistence is needed. A bean named jobLauncher is later used within the *Application Master* to launch jobs.

```
<bean id="yarnEventPublisher" class="org.springframework.yarn.event.DefaultYarnEventPublisher"/>
<yarn-batch:master/>
```

The declaration above defines BatchAppmaster bean named, by default, yarnAppmaster and YarnEventPublisher bean named yarnEventPublisher which is not created automatically.

Final step to finalize our very simple batch configuration is to define the actual batch job.

The declaration above defines a simple job and tasklet. Job is named as job which is the default job name searched by *Application Master*. It is possible to use different name by changing the launch configuration.

Table 13.16. yarn-batch: master attributes

Name	Values	Description
configuration	Bean Reference	A reference to configuration bean name, default is yarnConfiguration
resource- localizer	Bean Reference	A reference to resource localizer bean name, default is yarnLocalresources
environment	Bean Reference	A reference to environment bean name, default is yarnEnvironment
job-name	Bean Name Reference	A name reference to Spring Batch job, default is job
job-launcher	Bean Reference	A reference to job launcher bean name, default is <i>jobLauncher</i> . Target is a normal Spring Batch bean implementing JobLauncher.

Partitioning

Let's take a quick look how Spring Batch partitioning is handled. Concept of running a partitioned job involves three things, *Remote steps*, *Partition Handler* and a *Partitioner*. If we do a little bit of oversimplification a remote step is like any other step from a user point of view. Spring Batch itself does not contain implementations for any proprietary grid or remoting fabrics. Spring Batch does however provide a useful implementation of PartitionHandler that executes Steps locally in separate threads of execution, using the TaskExecutor strategy from Spring. Spring Hadoop provides implementation to execute Steps remotely on a Hadoop cluster.

Note

For more background information about the Spring Batch Partitioning, read the Spring Batch reference documentation.

Configuring Master

As we previously mentioned a step executed on a remote host also need to access a job repository. If job repository would be based on a database instance, configuration could be similar on a container compared to application master. In our configuration example the job repository is in-memory based and remote steps needs access for it. Spring Yarn Batch contains implementation of a job repository which is able to proxy request via json requests. Order to use that we need to enable application client service which is exposing this service.

he declaration above defines JobRepositoryRemoteService bean named jobRepositoryRemoteService which is then connected into *Application Master Service* exposing job repository via Spring Integration Tcp channels.

As job repository communication messages are exchanged via custom json messages, converters needs to be defined.

Configuring Container

Previously we made a choice to use in-memore job repository running inside the application master. Now we need to talk to this repository via client service. We start by adding same converters as in application master.

We use general client implementation able to communicate with a service running on Application Master.

```
<yarn-int:amservice-client
service-impl="org.springframework.yarn.integration.ip.mind.DefaultMindAppmasterServiceClient"
host="${SHDP_AMSERVICE_HOST}"
port="${SHDP_AMSERVICE_PORT}" />
```

Remote step is just like any other step.

```
<bean id="hello" class="org.springframework.yarn.examples.PrintTasklet">
    <property name="message" value="Hello"/>
    </bean>

<batch:step id="remoteStep">
    <batch:tasklet transaction-manager="transactionManager" start-limit="100" ref="hello"/>
    </batch:step>
```

We need to have a way to locate the step from an application context. For this we can define a step locator which is later configured into running container.

```
<bean id="stepLocator" class="org.springframework.yarn.batch.partition.BeanFactoryStepLocator"/>
```

Spring Hadoop contains a custom job repository implementation which is able to talk back to a remote instance via custom json protocol.

Finally we define a *Container* understanding how to work with a remote steps.

13.13 Using Spring Boot Application Model

We have additional support for leveraging *Spring Boot* when creating applications using *Spring YARN*. All dependencies for this exists in a sub-module named spring-yarn-boot which itself depends on *Spring Boot*.

Spring Boot extensions in Spring YARN are used to ease following issues:

- · Create a clear model how application is built, packaged and run on Hadoop YARN.
- Automatically configure components depending whether we are on Client, Appmaster or Container.
- Create an easy to use externalized configuration model based on Boot's ConfigurationProperties.

Before we get into details let's go through how simple it is to create and deploy a custom application to a Hadoop cluster. Notice that there are no need to use XML.

```
@Configuration
@EnableAutoConfiguration
public class ContainerApplication {

  public static void main(String[] args) {
    SpringApplication.run(ContainerApplication.class, args);
  }

  @Bean
  public HelloPojo helloPojo() {
    return new HelloPojo();
  }
}
```

In above ContainerApplication, notice how we added @Configuration in a class level itself and @Bean for a helloPojo() method.

```
@YarnComponent
public class HelloPojo {

private static final Log log = LogFactory.getLog(HelloPojo.class);

@Autowired
private Configuration configuration;

@OnContainerStart
public void publicVoidNoArgsMethod() {
 log.info("Hello from HelloPojo");
 log.info("About to list from hdfs root content");
 FsShell shell = new FsShell(configuration);
 for (FileStatus s : shell.ls(false, "/")) {
 log.info(s);
 }
}
```

HelloPojo class is a simple POJO in a sense that it doesn't extend any *Spring YARN* base classes. What we did in this class:

- We've added a class level@YarnComponent annotation.
- We've added a method level @OnContainerStart annotation.

· We've @Autowired a Hadoop's Configuration class.

To demonstrate that we actually have some real functionality in this class, we simply use Spring Hadoop's FsShell to list entries from a root of a HDFS file system. For this we need to have access to Hadoop's Configuration which is prepared for you so that you can just autowire it.

- @EnableAutoConfiguration tells Spring Boot to start adding beans based on classpath setting, other beans, and various property settings.
- Specific auto-configuration for Spring YARN components takes place since Spring YARN is on the classpath.

The main() method uses Spring Boot's SpringApplication.run() method to launch an application. From there we simply request a bean of type YarnClient and execute its submitApplication() method. What happens next depends on application configuration, which we go through later in this document.

```
@EnableAutoConfiguration
public class AppmasterApplication {

public static void main(String[] args) {
    SpringApplication.run(AppmasterApplication.class, args);
  }
}
```

Application class for YarnAppmaster looks even simpler than what we just did for ClientApplication. Again the main() method uses Spring Boot's SpringApplication.run() method to launch an application.

In real life, you most likely need to start adding more custom functionality to your application component and you'd do that by start adding more beans. To do that you need to define a Spring @Configuration or @ComponentScan. AppmasterApplication would then act as your main starting point to define more custom functionality.

Final part for your application is its runtime configuration which glues all the components together which then can be called as a Spring YARN application. This configuration act as source for Spring Boot's @ConfigurationProperties and contains relevant configuration properties which cannot be auto-discovered or otherwise needs to have an option to be overwritten by an end user.

You can then write your own defaults for your own environment. Because these @ConfigurationProperties are resolved at runtime by Spring Boot, you even have an easy option to overwrite these properties either by using command-line options or provide additional configuration property files.

Auto Configuration

Spring Boot is heavily influenced by auto-configuration trying to predict what user wants to do. These decisions are based on configuration properties, what's currently available from a classpath and generally everything what auto-configurers are able to see.

Auto-configuration is able to see if it's currently running on a YARN cluster and can also differentiate between *YarnContainer* and *YarnAppmaster*. Parts of the auto-configuration which cannot be automatically detected are guarded by a flags in configuration properties which then allows end-user to either enable or disable these functionalities.

Application Files

As we already mentioned *Spring Boot* creates a clear model how you would work with your application files. Most likely what you need in your application is jar or zip file(s) having needed application code and optional configuration properties to customize the application logic. Customization via an external properties files makes it easier to change application functionality and reduce a need to hard-code application logic.

Running an application on YARN needs an instance of *YarnAppmaster* and instances of _YarnContainer_s. Both of these containers will need a set of files and instructions how to execute a container. Based on auto-configuration and configuration properties we will make few assumptions how a container is executed.

We are fundamentally supporting three different type of combinations:

- If a container main archive file is a jar file we expect it to be packaged with Boot and be self container executable jar archive.
- If a container main archive is a zip file we expect it to be packages with Boot. In this case we use a special runner which knows how to run this exploded archive.
- User defines a main class to be run and everything this class will need is already setup.

More detailed functionality can be found from a below sections; the section called "Application Classpath", the section called "Container Runners" and the section called "Configuration Properties".

Application Classpath

Let's go through as an examples how a classpath is configured on different use cases.

Simple Executable Jar

Running a container using an executable jar archive is the most simple scenario due to classpath limitation imposed by a JVM. Everything needed for the classpath needs to be inside the archive itself. Boot plugins for maven and gradle will greatly help to package all library dependencies into this archive.

```
spring:
    yarn:
    client:
        launchcontext:
        archiveFile: yarn-boot-appmaster-0.1.0.jar
    appmaster:
        launchcontext:
        archiveFile: yarn-boot-container-0.1.0.jar
```

Simple Zip Archive

Using a zip archive is basically needed in two use cases. In first case you want to re-use existing libraries in YARN cluster for your classpath. In second case you want to add custom classpath entries from an exploded zip archive.

```
spring:
   yarn:
    siteYarnAppClasspath: "/path/to/hadoop/libs/*"
   appmaster:
    launchcontext:
        useYarnAppClasspath: true
        archiveFile: yarn-boot-container-0.1.0.zip
```

In above example you can have a zip archive which doesn't bundle all dependant Hadoop YARN libraries. Default classpath entries are then resolved from siteYarnAppClasspath property.

```
spring:
    yarn:
    appmaster:
    launchcontext:
        archiveFile: yarn-boot-container-0.1.0.zip
        containerAppClasspath:
        - "./yarn-boot-container-0.1.0.zip/config"
        - "./yarn-boot-container-0.1.0.zip/lib"
```

In above example you needed to use custom classpath entries from an exploded zip archive.

Container Runners

Using a propertys spring.yarn.client.launchcontext.archiveFile and spring.yarn.appmaster.launchcontext.archiveFile respectively, will indicate that container is run based on an archive file and Boot runners are used. These runner classes are either used manually when constructing an actual raw command for container or internally within an executable jar archive.

However there are times when you may need to work on much lower level. Maybe you are having trouble using an executable jar archive or Boot runner is not enough what you want to do. For this use case you would use propertys <code>spring.yarn.client.launchcontext.runnerClass</code> and <code>spring.yarn.appmaster.launchcontext.runnerClass</code>.

Custom Runner

```
spring:
    yarn:
    appmaster:
    launchcontext:
       runnerClass: com.example.MyMainClazz
```

Resource Localizing

Order for containers to use application files, a YARN resource localization process needs to do its tasks. We have a few configuration properties which are used to determine which files are actually localized into container's working directory.

```
spring:
  yarn:
    client:
     localizer:
         - "*appmaster*jar"
         - "*appmaster*zip"
        zipPattern: "*zip"
        propertiesNames: [application]
        propertiesSuffixes: [properties, yml]
    appmaster:
      localizer:
         - "*container*iar"
         - "*container*zip"
        zipPattern: "*zip"
        propertiesNames: [application]
        propertiesSuffixes: [properties, yml]
```

Above is an example which equals a default functionality when localized resources are chosen. For example for a container we automatically choose all files matching a simple patterns *container*jar and *container*zip. Additionally we choose configuration properties files matching names application.properties and application.yml. Property zipPattern is used as an pattern to instruct YARN resource localizer to triet file as an archive to be automatically exploded.

If for some reason the default functionality and how it can be configured via configuration properties is not suiteable, one can define a custom bean to change how things work. Interface LocalResourcesSelector is used to find localized resources.

```
public interface LocalResourcesSelector {
  List<Entry> select(String dir);
}
```

Below you see a logic how a default BootLocalResourcesSelector is created during the auto-configuration. You would then create a custom implementation and create it as a bean in your Configuration class. You would not need to use any Conditionals but not how in auto-configuration we use @ConditionalOnMissingBean to check if user have already created his own implementation.

```
@Configuration
@EnableConfigurationProperties({ SpringYarnAppmasterLocalizerProperties.class })
public static class LocalResourcesSelectorConfig {
  @Autowired
 private SpringYarnAppmasterLocalizerProperties syalp;
  @ConditionalOnMissingBean(LocalResourcesSelector.class)
 public LocalResourcesSelector localResourcesSelector() {
   BootLocalResourcesSelector selector = new BootLocalResourcesSelector(Mode.CONTAINER);
   if (StringUtils.hasText(syalp.getZipPattern())) {
     selector.setZipArchivePattern(syalp.getZipPattern());
   if (syalp.getPropertiesNames() != null) {
     selector.setPropertiesNames(syalp.getPropertiesNames());
   if (syalp.getPropertiesSuffixes() != null) {
     selector.setPropertiesSuffixes(syalp.getPropertiesSuffixes());
   selector.addPatterns(syalp.getPatterns());
   return selector;
  }
}
```

Your configuration could then look like:

```
@EnableAutoConfiguration
public class AppmasterApplication {

    @Bean
    public LocalResourcesSelector localResourcesSelector() {
        return MyLocalResourcesSelector();
    }

    public static void main(String[] args) {
        SpringApplication.run(AppmasterApplication.class, args);
    }
}
```

Container as POJO

In Boot application model if *YarnContainer* is not explicitly defined it defaults to *DefaultYarnContainer* which expects to find a POJO created as a bean having a specific annotations instructing the actual functionality.

@YarnComponent is a stereotype annotation itself having a Spring's @Component defined in it. This is automatically marking a class to be a candidate having a @YarnComponent functionality.

Within a POJO class we can use @OnContainerStart annotation to mark a public method to act as an activator for a method endpoint.

Note

Return values from a @OnContainerStart will participate to a container exit value. If you omit these methods from a @YarnComponent, no return values are present thus making container not to exist automatically. This is useful in cases where you just want to have a mvc endpoints interacting with other containers. Otherwise you need to use dummy thread sleep or return a Future value.

```
@OnContainerStart
public void publicVoidNoArgsMethod() {
}
```

Returning type of int participates in a YarnContainer exit value.

```
@OnContainerStart
public int publicIntNoArgsMethod() {
  return 0;
}
```

Returning type of boolean participates in a *YarnContainer* exit value where *true* would mean complete and *false* failed container.

```
@OnContainerStart
public boolean publicBooleanNoArgsMethod() {
  return true;
}
```

Returning type of String participates in a *YarnContainer* exit value by matching ExitStatus and getting exit value from ExitCodeMapper.

```
@OnContainerStart
public String publicStringNoArgsMethod() {
  return "COMPLETE";
}
```

If method throws any Exception YarnContainer is marked as failed.

```
@OnContainerStart
public void publicThrowsException() {
   throw new RuntimeExection("My Error");
}
```

Method parameter can be bound with @YarnEnvironments to get access to current YarnContainer environment variables.

```
@OnContainerStart
public void publicVoidEnvironmentsArgsMethod(@YarnEnvironments Map<String,String> env) {
}
```

Method parameter can be bound with @YarnEnvironment to get access to specific YarnContainer environment variable.

```
@OnContainerStart
public void publicVoidEnvironmentArgsMethod(@YarnEnvironment("key") String value) {
}
```

Method parameter can be bound with @YarnParameters to get access to current YarnContainer arguments.

```
@OnContainerStart
public void publicVoidParametersArgsMethod(@YarnParameters Properties properties) {
}
```

Method parameter can be bound with @YarnParameter to get access to a specific YarnContainer arguments.

```
@OnContainerStart
public void publicVoidParameterArgsMethod(@YarnParameter("key") String value) {
}
```

It is possible to use multiple @YarnComponent classes and @OnContainerStart methods but a care must be taken in a way execution happens. In default these methods are executed synchronously and ordering is pretty much random. Few tricks can be used to overcome synchronous execution and ordering.

We support `@Order' annotation both on class and method levels. If `@Order' is defined on both the one from method takes a presense.

```
@YarnComponent
@Order(1)
static class Bean {

    @OnContainerStart
    @Order(10)
    public void method1() {
    }

    @OnContainerStart
    @Order(11)
    public void method2() {
    }
}
```

@OnContainerStart also supports return values of Future or ListenableFuture. This is a convenient way to do something asynchronously because future is returned immediately and execution goes to a next method and later waits future values to be set.

```
@YarnComponent
static class Bean {

@OnContainerStart
Future<Integer> void method1() {
    return new AsyncResult<Integer>(1);
}

@OnContainerStart
Future<Integer> void method1() {
    return new AsyncResult<Integer>(2);
}
```

Below is an example to use more sophisticated functionality with a ListenableFuture and scheduling work within a @OnContainerStart method. In this case YarnContainerSupport class simply provides an easy access to a TaskScheduler.

```
static class Bean extends YarnContainerSupport {
 @OnContainerStart
 public ListenableFuture<?> method() throws Exception {
   final MyFuture future = new MyFuture();
   getTaskScheduler().schedule(new FutureTask<Void>(new Runnable() {
     public void run() {
       try {
         while (!future.interrupted) {
           // do something
       } catch (Exception e) {
          // bail out from error
         future.set(false);
       }
   }, null), new Date());
   return future;
 static class MyFuture extends SettableListenableFuture<Boolean> {
   boolean interrupted = false;
   @Override
   protected void interruptTask() {
     interrupted = true;
```

Configuration Properties

Configuration properties can be defined using various methods. See a Spring Boot dodumentation for details. More about configuration properties for spring.hadoop namespace can be found from Section 3.4, "Boot Support".

spring.yarn configuration properties

Namespace spring.yarn supports following properties; applicationDir, applicationBaseDir, applicationVersion, stagingDir, appName, appType, siteYarnAppClasspath and siteMapreduceAppClasspath.

```
spring.yarn.applicationDir
```

Description

An application home directory in hdfs. If client copies files into a hdfs during an application submission, files will end up in this directory. If this property is omitted, a staging directory will be used instead.

Required

No

Type

String

```
Default Value
       null
spring.yarn.applicationBaseDir
   Description
       An applications base directory where build-in application deployment functionality would create
       a new application instance. For a normal application submit operation, this is not needed.
   Required
       No
   Type
       String
   Default Value
       null
spring.yarn.applicationVersion
   Description
       An application version identifier used together with applicationBaseDir in deployment
       scenarios where applicationDir cannot be hard coded.
   Required
       No
   Type
       String
   Default Value
       null
spring.yarn.stagingDir
   Description
       A global staging base directory in hdfs.
   Required
       No
   Type
       String
   Default Value
       /spring/staging
spring.yarn.appName
   Description
       Defines a registered application name visible from a YARN resource manager.
   Required
       No
   Type
```

String

```
Default Value
       null
spring.yarn.appType
   Description
       Defines a registered application type used in YARN resource manager.
   Required
       No
   Type
       String
   Default Value
       YARN
spring.yarn.siteYarnAppClasspath
   Description
       Defines a default base YARN application classpath entries.
   Required
       No
   Type
       String
   Default Value
       null
spring.yarn.siteMapreduceAppClasspath
   Description
       Defines a default base MR application classpath entries.
   Required
       No
   Type
       String
   Default Value
       null
```

${\tt spring.yarn.appmaster} \ {\tt configuration} \ {\tt properties}$

Namespace spring.yarn.appmaster supports following properties; appmasterClass, containerCount and keepContextAlive.

```
spring.yarn.appmaster.appmasterClass
```

Description

Fully qualified classname which auto-configuration can automatically instantiate as a custom application master.

Required No Type Class Default Value null spring.yarn.app Description Property when the choose to units the choose to the choose the

spring.yarn.appmaster.containerCount

Property which is automatically kept in configuration as a hint which an application master can choose to use when determing how many containers should be launched.

Required

No

Type

Integer

Default Value

1

spring.yarn.appmaster.keepContextAlive

Description

Setting for an application master runner to stop main thread to wait a latch before continuing. This is needed in cases where main thread needs to wait event from other threads to be able to exit.

Required

No

Type

Boolean

Default Value

true

spring.yarn.appmaster.launchcontext configuration properties

Namespace spring.yarn.appmaster.launchcontext supports following properties; archiveFile, runnerClass, options, arguments, containerAppClasspath, pathSeparator, includeBaseDirectory, useYarnAppClasspath, useMapreduceAppClasspath, includeSystemEnv and locality.

```
spring.yarn.appmaster.launchcontext.archiveFile
```

Description

Indicates that a container main file is treated as executable jar or exploded zip.

Required

No

Type

String

```
Default Value
       null
spring.yarn.appmaster.launchcontext.runnerClass
   Description
       Indicates a fully qualified class name for a container runner.
   Required
       No
   Type
       Class
   Default Value
       null
spring.yarn.appmaster.launchcontext.options
   Description
       JVM system options.
   Required
       No
   Type
       List
   Default Value
       null
spring.yarn.appmaster.launchcontext.arguments
   Description
       JVM system options.
   Required
       No
   Type
       Мар
   Default Value
       null
\verb|spring.yarn.appmaster.launchcontext.containerAppClasspath|\\
   Description
       Additional classpath entries.
   Required
       No
   Type
       List
```

```
Default Value
       null
spring.yarn.appmaster.launchcontext.pathSeparator
   Description
       Separator in a classpath.
   Required
       No
   Type
       String
   Default Value
       null
spring.yarn.appmaster.launchcontext.includeBaseDirectory
   Description
       If base directory should be added in a classpath.
   Required
       No
   Type
       Boolean
   Default Value
       true
\verb|spring.yarn.appmaster.launchcontext.useYarnAppClasspath|\\
   Description
       If default yarn application classpath should be added.
   Required
       No
   Type
       Boolean
   Default Value
       true
spring.yarn.appmaster.launchcontext.useMapreduceAppClasspath
   Description
       If default mr application classpath should be added.
   Required
       No
   Type
       Boolean
   Default Value
       true
```

```
spring.yarn.appmaster.launchcontext.includeSystemEnv
   Description
       If system environment variables are added to a container environment.
   Required
       No
   Type
       Boolean
   Default Value
       true
spring.yarn.appmaster.launchcontext.locality
   Description
       If set to true indicates that resources are not relaxed.
   Required
       No
   Type
       Boolean
   Default Value
       false
spring.yarn.appmaster.localizer configuration properties
Namespace spring.yarn.appmaster.localizer supports following properties; patterns,
zipPattern, propertiesNames and propertiesSuffixes.
spring.yarn.appmaster.localizer.patterns
   Description
       A simple patterns to choose localized files.
   Required
       No
   Type
       List
   Default Value
       null
spring.yarn.appmaster.localizer.zipPattern
   Description
       A simple pattern to mark a file as archive to be exploded.
   Required
       No
   Type
       String
```

```
Default Value
       null
spring.yarn.appmaster.localizer.propertiesNames
   Description
       Base name of a configuration files.
   Required
       No
   Type
       List
   Default Value
       null
spring.yarn.appmaster.localizer.propertiesSuffixes
   Description
       Suffixes for a configuration files.
   Required
       No
   Type
       List
   Default Value
       null
spring.yarn.appmaster.resource configuration properties
Namespace spring.yarn.appmaster.resource supports following properties; priority, memory
and virtualCores.
spring.yarn.appmaster.resource.priority
   Description
       Container priority.
   Required
       No
   Type
       String
   Default Value
       null
spring.yarn.appmaster.resource.memory
   Description
       Container memory allocation.
   Required
       No
```

```
Type
       String
   Default Value
       null
spring.yarn.appmaster.resource.virtualCores
   Description
       Container cpu allocation.
   Required
       No
   Type
       String
   Default Value
       null
spring.yarn.appmaster.containercluster configuration properties
Namespace spring.yarn.appmaster.containercluster supports following properties;
clusters.
spring.yarn.appmaster.containercluster.clusters
   Description
       Definitions of container clusters.
   Required
       No
   Type
       Мар
   Default Value
       null
spring.yarn.appmaster.containercluster.clusters.<name> configuration properties
              spring.yarn.appmaster.containercluster.clusters.<name>
                                                                                    supports
following properties; resource, launchcontext, localizer and projection.
spring.yarn.appmaster.containercluster.clusters.<name>.resource
   Description
       Same as <a href="mailto:spring.yarn.appmaster.resource">spring.yarn.appmaster.resource</a> config property.
   Required
       No
   Type
       Config
   Default Value
       null
```

```
spring.yarn.appmaster.containercluster.clusters.<name>.launchcontext
   Description
       Same as <a href="mailto:spring.yarn.appmaster.launchcontext">spring.yarn.appmaster.launchcontext</a> config property.
   Required
       No
   Type
       Config
   Default Value
       null
spring.yarn.appmaster.containercluster.clusters.<name>.localizer
   Description
       Same as <a href="mailto:spring.yarn.appmaster.localizer">spring.yarn.appmaster.localizer</a> config property.
   Required
       No
   Type
       Config
   Default Value
       null
spring.yarn.appmaster.containercluster.clusters.<name>.projection
   Description
       Config collection for a projection settings.
   Required
       No
   Type
       Config
   Default Value
       null
spring.yarn.appmaster.containercluster.clusters.<name>.projection
configuration properties
Namespace spring.yarn.appmaster.containercluster.clusters.<name>.projection
supports following properties; type and data.
spring.yarn.appmaster.containercluster.clusters.<name>.projection.type
   Description
       Type of a projection to use. default is supported on default or any other projection added
       via a custom factory.
   Required
       No
```

```
Type
       String
   Default Value
       null
spring.yarn.appmaster.containercluster.clusters.<name>.projection.data
   Description
       Map of config keys and values. any takes an integer, hosts as name to integer map, racks
       as name to integer map, properties as a generic map values.
   Required
```

No

Type

Мар

Default Value

null

spring.yarn.endpoints.containercluster configuration properties

Namespace spring.yarn.endpoints.containercluster supports following properties; enabled.

spring.yarn.endpoints.containercluster.enabled

Description

Enabling endpoint MVC REST API controlling container clusters.

Required

No

Type

Boolean

Default Value

false

spring.yarn.endpoints.containerregister configuration properties

Namespace spring.yarn.endpoints.containerregister supports following properties; enabled.

spring.yarn.endpoints.containerregister.enabled

Description

Enabling container registering endpoint. This is needed if graceful application shutdown is needed.

Required

No

Type

Boolean

```
Default Value false
```

spring.yarn.client configuration properties

Namespace <code>spring.yarn.client</code> supports following properties; files, priority, queue, clientClass and startup.action.

```
spring.yarn.client.files
   Description
       Files to copy into hdfs during application submission.
   Required
       No
   Type
       List
   Default Value
       null
spring.yarn.client.priority
   Description
       Application priority.
   Required
       No
   Type
       Integer
   Default Value
       null
spring.yarn.client.queue
   Description
       Application submission queue.
   Required
       No
   Type
       String
   Default Value
       null
spring.yarn.client.clientClass
       Fully qualified classname which auto-configuration can automatically instantiate as a custom
       client.
```

```
Required
       No
   Type
       Class
   Default Value
       null
spring.yarn.client.startup.action
   Description
       Default action to perform on YarnClient. Currently only one action named submit is supported.
       This action is simply calling submitApplication method on YarnClient.
   Required
       No
   Type
       String
   Default Value
       null
spring.yarn.client.launchcontext configuration properties
Namespace spring.yarn.client.launchcontext supports following properties; archiveFile,
runnerClass, options, arguments, containerAppClasspath, pathSeparator, includeBaseDirectory,
<u>useYarnAppClasspath</u>, <u>useMapreduceAppClasspath</u> and <u>includeSystemEnv</u>.
spring.yarn.client.launchcontext.archiveFile
       Indicates that a container main file is treated as executable jar or exploded zip.
   Required
       No
   Type
```

String

Default Value

null

spring.yarn.client.launchcontext.runnerClass

Description

Indicates a fully qualified class name for a container runner.

Required

No

Type

Class

```
Default Value
      null
spring.yarn.client.launchcontext.options
   Description
      JVM system options.
   Required
      No
   Type
       List
   Default Value
      null
spring.yarn.client.launchcontext.arguments
   Description
      JVM system options.
   Required
      No
   Type
       Мар
   Default Value
       null
spring.yarn.client.launchcontext.containerAppClasspath
   Description
      Additional classpath entries.
   Required
      No
   Type
      List
   Default Value
       null
spring.yarn.client.launchcontext.pathSeparator
   Description
       Separator in a classpath.
   Required
      No
   Type
       String
```

```
Default Value
       null
spring.yarn.client.launchcontext.includeBaseDirectory
   Description
       If base directory should be added in a classpath.
   Required
       No
   Type
       Boolean
   Default Value
       true
spring.yarn.client.launchcontext.useYarnAppClasspath
   Description
       If default yarn application classpath should be added.
   Required
       No
   Type
       Boolean
   Default Value
       true
\verb|spring.yarn.client.launchcontext.useMapreduceAppClasspath|\\
   Description
       If default mr application classpath should be added.
   Required
       No
   Type
       Boolean
   Default Value
       true
spring.yarn.client.launchcontext.includeSystemEnv
   Description
       If system environment variables are added to a container environment.
   Required
       No
   Type
       Boolean
```

```
true
spring.yarn.client.localizer configuration properties
Namespace spring.yarn.appmaster.localizer supports following properties; patterns,
zipPattern, propertiesNames and propertiesSuffixes.
spring.yarn.client.localizer.patterns
   Description
       A simple patterns to choose localized files.
   Required
       No
   Type
       List
   Default Value
       null
spring.yarn.client.localizer.zipPattern
   Description
       A simple pattern to mark a file as archive to be exploded.
   Required
       No
   Type
       String
   Default Value
       null
spring.yarn.client.localizer.propertiesNames
   Description
       Base name of a configuration files.
   Required
       No
   Type
       List
   Default Value
       null
spring.yarn.client.localizer.propertiesSuffixes
   Description
       Suffixes for a configuration files.
   Required
```

No

Default Value

```
Type
List
Default Value
```

null

spring.yarn.client.resource configuration properties

Namespace spring.yarn.client.resource supports following properties; memory and virtualCores.

```
spring.yarn.client.resource.memory
```

Description

Container memory allocation.

Required

No

Type

String

Default Value

null

spring.yarn.client.resource.virtualCores

Description

Container cpu allocation.

Required

No

Type

String

Default Value

null

spring.yarn.container configuration properties

Namespace spring.yarn.container supports following properties; keepContextAlive and containerClass.

```
spring.yarn.container.keepContextAlive
```

Description

Setting for an application container runner to stop main thread to wait a latch before continuing. This is needed in cases where main thread needs to wait event from other threads to be able to exit.

Required

No

Type

Boolean

Default Value

true

spring.yarn.container.containerClass

Description

Fully qualified classname which auto-configuration can automatically instantiate as a custom container.

Required

No

Type

Class

Default Value

null

spring.yarn.batch configuration properties

Namespace spring.yarn.batch supports following properties; name, enabled and jobs.

```
spring.yarn.batch.name
```

Description

Comma-delimited list of search patterns to find jobs to run defined either locally in application context or in job registry.

Required

No

Type

String

Default Value

null

spring.yarn.batch.enabled

Description

Indicates if batch processing on yarn is enabled.

Required

No

Type

Boolean

Default Value

false

spring.yarn.batch.jobs

Description

Configures a list of individual configuration properties for jobs.

```
Required
No
Type
List
Default Value
null
ring.yarn.b
```

spring.yarn.batch.jobs configuration properties

Namespace spring.yarn.batch.jobs supports following properties; name, enabled, next, failNext, restart, failRestart and parameters.

```
spring.yarn.batch.jobs.name
   Description
       Name of a job to configure.
   Required
       No
   Type
       String
   Default Value
       null
spring.yarn.batch.jobs.enabled
   Description
       Indicates if job is enabled.
   Required
       No
   Type
       Boolean
   Default Value
       false
spring.yarn.batch.jobs.next
   Description
       Indicates if job parameters incrementer is used to prepare a job for next run.
   Required
       No
   Type
       Boolean
```

Default Value false

```
spring.yarn.batch.jobs.failNext
   Description
       Indicates if job execution should fail if job cannot be prepared for next execution.
   Required
       No
   Type
       Boolean
   Default Value
       false
spring.yarn.batch.jobs.restart
   Description
       Indicates of job should be restarted.
   Required
       No
   Type
       Boolean
   Default Value
       false
spring.yarn.batch.jobs.failRestart
   Description
       Indicates if job execution should fail if job cannot be restarted.
   Required
       No
   Type
       Boolean
   Default Value
       false
spring.yarn.batch.jobs.parameters
   Description
       Defines a Map of additional job parameters. Keys and values are in normal format supported
       by Batch.
   Required
       No
   Type
       Мар
   Default Value
       null
```

Container Groups

Hadoop YARN is a simple resource scheduler and thus doesn't provide any higher level functionality for controlling containers for failures or grouping. Currently these type of features need to be implemented atop of YARN using a third party components such as Spring YARN. Containers controlled by YARN are handled as one big pool of resources and any functionality for grouping containers needs to be implemented within a custom application master. Spring YARN provides components which can be used to control containers as groups.

Container Group is a logical representation of containers managed by a single YARN application. In a typical YARN application a container which is allocated and launched shares a same configuration for Resource(memory, cpu), Localized Files(application files) and Launch Context(process command). Grouping brings a separate configuration for each group which allows to run different logical applications within a one application master. Logical application simply mean that different containers are meant to do totally different things. A simple use case for such things is an application which needs to run two different types of containers, admin and worker nodes respectively.

YARN itself is not meant to be a task scheduler meaning you can't request a container for specific task which would then run on a Hadoop cluster. In layman's terms this simply mean that you can't associate a container allocation request for response received from a resource manager. This decision was made to keep a resource manager relatively light and spawn all the task activities into an application master. All the allocated containers are requested and received from YARN asynchronously thus making a one big pool of resources. All the task activities needs to be build using this pool. This brings a new concept of doing a container projection from a single allocated pool of containers.

Application Master which is meant to be used with container groups need to implement interface ContainerClusterAppmaster shown below. Currently one built-in implementation org.springframework.yarn.am.cluster.ManagedContainerClusterAppmaster exists.

ManagedContainerClusterAppmaster, Order to use default implementation configure using spring.yarn.appmaster.appmasterClass configuration lf you control this container groups externally via internal rest api, set spring.yarn.endpoints.containercluster.enabled to true.

```
spring:
    yarn:
    appmaster:
    appmasterClass: org.springframework.yarn.am.cluster.ManagedContainerClusterAppmaster
    endpoints:
    containercluster:
    enabled: true
```

Grid Projection

Container cluster is always associated with a grid projection. This allows de-coupling of cluster configuration and its grid projection. Cluster or group is not directly aware of how containers are chosen.

```
public interface GridProjection {
  boolean acceptMember(GridMember member);
  GridMember removeMember(GridMember member);
  Collection<GridMember> getMembers();
  SatisfyStateData getSatisfyState();
  void setProjectionData(ProjectionData data);
  ProjectionData getProjectionData();
}
```

GridProjection has its projection configuration in ProjectionData. SatisfyStateData defines a data object to satisfy a grid projection state.

Projections are created via GridProjectionFactory beans. Default factory named as gridProjectionFactory currently handles one different type of projection named DefaultGridProjection which is registered with name default. You can replace this factory by defining a bean with a same name or introduce more factories just by defining your own factory implementations.

```
public interface GridProjectionFactory {
   GridProjection getGridProjection(ProjectionData projectionData);
   Set<String> getRegisteredProjectionTypes();
}
```

Registered types needs to be mapped into projections itself created by a factory. For example default implementation does mapping of type default.

Group Configuration

Typical configuration is shown below:

```
spring:
 hadoop:
   fsUri: hdfs://node1:8020
   resourceManagerHost: node1
   appType: BOOT
   appName: gs-yarn-uimodel
    applicationBaseDir: /app/
   applicationDir: /app/gs-yarn-uimodel/
     appmasterClass: org.springframework.yarn.am.cluster.ManagedContainerClusterAppmaster
     keepContextAlive: true
     containercluster:
       clusters:
         cluster1:
            projection:
              type: default
              data:
               any: 1
               hosts:
                 node3: 1
                 node4: 1
               racks:
                  rack1: 1
                 rack2: 1
            resource:
             priority: 1
              memory: 64
             virtualCores: 1
            launchcontext:
             locality: true
              archiveFile: gs-yarn-uimodel-cont1-0.1.0.jar
            localizer:
              patterns:
                - "*cont1*jar"
```

These container cluster configurations will also work as a blueprint when creating groups manually on demand. If projectionType is defined in a configuration it indicates that a group should be created automatically.

Container Restart

Currently a simple support for automatically re-starting a failed container is implemented by a fact that if container goes away group projection is no longer satisfied and Spring YARN will try to allocate and start new containers as long as projection is satisfied again.

REST API

While grouping configuration can be static and solely be what's defined in a yml file, it would be a nice feature if you could control the runtime behaviour of these groups externally. REST API provides methods to create groups with a specific projects, start group, stop group and modify group projection.

Boot based REST API endpoint need to be explicitly enabled by using a configuration shown below:

```
spring:
    yarn:
    endpoints:
        containercluster:
        enabled: true
```

GET /yarn_containercluster

Returns info about existing clusters

Response Class

```
ContainerClusters {
  clusters (array[string])
}
```

Response Schema

```
{
    "clusters":[
        "<clusterId>"
    ]
}
```

POST /yarn_containercluster

Create a new container cluster

Parameters

Parameter	Description	Parameter Type	Data Type
body	Cluster to be created	body	Request Class.

Parameter	Description	Parameter Type	Data Type
			<pre>Cluster { clusterId (string), clusterDef (string), projection (string), projectionData (ProjectionData), extraProperties (map<string,object>) } ProjectionData { type (string), priority (integer), any (integer, optional), hosts (map, optional), racks (map, optional) } Request Schema. { "clusterId":"", "projectionData":{ "any":0, "hosts":{ "<hostname>":0 }, "racks":{ "<rackname>":0 }, "extraProperties":{ } } } </rackname></hostname></string,object></pre>

Response Messages

HTTP Status Code	Reason	Response Model
405	Invalid input	

GET /yarn_containercluster/{clusterId}
Returns info about a container cluster.

Response Class

```
ContainerCluster {
 id (string): unique identifier for a cluster,
  gridProjection (GridProjection),
 containerClusterState (ContainerClusterState)
GridProjection {
 members (array[Member]),
 projectionData (ProjectionData),
 satisfyState (SatisfyState)
Member {
id (string): unique identifier for a member,
ProjectionData {
 type (string),
 priority (integer),
 any (integer, optional),
 hosts (map, optional),
 racks (map, optional)
SatisfyState {
removeData (array(string)),
 allocateData (AllocateData)
AllocateData {
 any (integer, optional),
 hosts (map, optional),
 racks (map, optional)
ContainerClusterState {
clusterState (string)
```

Response Schema

```
"id":"",
"gridProjection":{
  "members":[
     "id":""
   }
  "projectionData":{
   "type":"",
   "priority":0,
   "any":0,
"hosts":{
   "racks":{
  "satisfyState":{
   "removeData":[
    "allocateData":{
     "any":0,
     "hosts":{
      "racks":{
"containerClusterState":{
 "clusterState":""
```

Parameters

Parameter	Description	Parameter Type	Data Type
clusterId	ID of a cluster needs to be fetched	path	string

Response Messages

HTTP Status Code	Reason	Response Model
404	No such cluster	

PUT /yarn_containercluster/{clusterId}

Modify a container cluster state.

Parameters

Parameter	Description	Parameter Type	Data Type
clusterId	ID of a cluster needs to be fetched	path	string

Parameter	Description	Parameter Type	Data Type
	Cluster state to be modified	body	Request Class. ContainerClusterModifyRequest { action (string) } Request Schema.
			{ "action":"" }

Response Messages

HTTP Status Code	Reason	Response Model
404	No such cluster	
404	No such action	

PATCH /yarn_containercluster/{clusterId} Modify a container cluster projection.

Parameters

clusterId ID of a cluster no to be fetco body Cluster to created		string
•	illou	
	be body	<pre>Request Class. Cluster { clusterId (string), clusterDef (string), projection (string), projectionData (ProjectionData), extraProperties (map<string,object>) } ProjectionData { type (string), priority (integer), any (integer, optional), hosts (map, optional), racks (map, optional) }</string,object></pre> Request Schema.

Parameter	Description	Parameter Type	Data Type
			<pre>{ "clusterId":"", "projection":"", "projectionData":{ "any":0, "hosts":{ "<hostname>":0 }, "racks":{ "<rackname>":0 } } }</rackname></hostname></pre>

Response Messages

HTTP Status Code	Reason	Response Model
404	No such cluster	

DELETE /yarn_containercluster/{clusterId}
Destroy a container cluster.

Parameters

Parameter	Description	Parameter Type	Data Type
clusterId	ID of a cluster needs to be fetched	path	string

Response Messages

HTTP Status Code	Reason	Response Model
404	No such cluster	

Controlling Applications

We've already talked about how resources are localized into a running container. These resources are always localized from a HDFS file system which effectively means that the whole process of getting application files into a newly launched YARN application is a two phase process; firstly files are copied into HDFS and secondly files are localized from a HDFS.

When application instance is submitted into YARN, there are two ways how these application files can be handled. First which is the most obvious is to just copy all the necessary files into a known location in HDFS and then instruct YARN to localize files from there. Second method is to split this into two different stages, first install application files into HDFS and then submit application from there. At first there seem to be no difference with these two ways to handle application deployment. However if files are always copied into HDFS when application is submitted, you need a physical access to those files. This may not

always be possible so it's easier if you have a change to prepare these files by first installing application into HDFS and then just send a submit command to a YARN resource manager.

To ease a process of handling a full application life cycle, few utility classes exist which are meant to be used with Spring Boot. These classes are considered to be a foundational Boot application classes, not a ready packaged Boot executable jars. Instead you would use these from your own application whether that application is a Boot or other Spring based application.

Generic Usage

Internally these applications are executed using a SpringApplicationBuilder and a dedicated *Spring Application Context*. This allows to isolate Boot application instance from your current context if you have one. One fundamental idea in these applications is to make it possible to work with Spring profiles and Boot configuration properties. If your existing application is already using profiles and configuration properties, simply launching a new Boot would most likely derive those settings automatically which is something what you may not want.

AbstractClientApplication which all these built-in applications are based on contains methods to work with *Spring profiles* and additional configuration properties.

Let's go through all this using an example:

Using Configuration Properties

Below sample is pretty much a similar from all other examples except of two settings, applicationBaseDir and clientClass. Property applicationBaseDir defines where in HDFS a new app will be installed. DefaultApplicationYarnClient defined using clientClass adds better functionality to guard against starting app which doesn't exist or not overwriting existing apps in HDFS.

```
spring:
 hadoop:
   fsUri: hdfs://localhost:8020
   resourceManagerHost: localhost
 yarn:
    appType: GS
   appName: qs-yarn-appmodel
   applicationBaseDir: /app/
   applicationDir: /app/qs-yarn-appmodel/
     clientClass: org.springframework.yarn.client.DefaultApplicationYarnClient
        - "file:build/libs/gs-yarn-appmodel-container-0.1.0.jar"
        - "file:build/libs/gs-yarn-appmodel-appmaster-0.1.0.jar"
     launchcontext:
       archiveFile: gs-yarn-appmodel-appmaster-0.1.0.jar
    appmaster:
      containerCount: 1
     launchcontext:
        archiveFile: gs-yarn-appmodel-container-0.1.0.jar
```

Using YarnPushApplication

YarnPushApplication is used to push your application into HDFS.

```
public void doInstall() {
   YarnPushApplication app = new YarnPushApplication();
   app.applicationVersion("version1");
   Properties instanceProperties = new Properties();
   instanceProperties.setProperty("spring.yarn.applicationVersion", "version1");
   app.configFile("application.properties", instanceProperties);
   app.run();
}
```

In above example we simply created a YarnPushApplication, set its applicationVersion and executed a run method. We also instructed YarnPushApplication to write used applicationVersion into a configuration file named application.properties so that it'd be available to an application itself.

Using YarnSubmitApplication

YarnSubmitApplication is used to submit your application from HDFS into YARN.

```
public void doSubmit() {
   YarnSubmitApplication app = new YarnSubmitApplication();
   app.applicationVersion("version1");
   ApplicationId applicationId = app.run();
}
```

In above example we simply created a YarnSubmitApplication, set its applicationVersion and executed a run method.

Using YarnInfoApplication

YarnInfoApplication is used to query application info from a YARN Resource Manager and HDFS.

```
public void doListPushed() {
 YarnInfoApplication app = new YarnInfoApplication();
 Properties appProperties = new Properties();
 appProperties.setProperty("spring.yarn.internal.YarnInfoApplication.operation", "PUSHED");
 app.appProperties(appProperties);
 String info = app.run();
 System.out.println(info);
public void doListSubmitted() {
 YarnInfoApplication app = new YarnInfoApplication();
 Properties appProperties = new Properties();
 appProperties.setProperty("spring.yarn.internal.YarnInfoApplication.operation", "SUBMITTED");
 appProperties.setProperty("spring.yarn.internal.YarnInfoApplication.verbose", "true");
 appProperties.setProperty("spring.yarn.internal.YarnInfoApplication.type", "GS");
 app.appProperties(appProperties);
 String info = app.run();
 System.out.println(info);
```

In above example we simply created a YarnInfoApplication, and used it to list installed and running applications. By adding appProperties will make Boot to pick these properties after every other source of configuration properties but still allows to pass command-line options to override everything which is a normal way in Boot.

Using YarnKillApplication

YarnKillApplication is used to kill running application instances.

```
public void doKill() {
    YarnKillApplication app = new YarnKillApplication();
    Properties appProperties = new Properties();

appProperties.setProperty("spring.yarn.internal.YarnKillApplication.applicationId", "application_1395058039949_0052");
    app.appProperties(appProperties);
    String info = app.run();
    System.out.println(info);
}
```

In above example we simply created a YarnKillApplication, and used it to send a application kill request into a YARN resource manager.

Using YarnShutdownApplication

YarnShutdownApplication is used to gracefully shutdown running application instances.

```
public void doShutdown() {
    YarnShutdownApplication app = new YarnShutdownApplication();
    Properties appProperties = new Properties();

appProperties.setProperty("spring.yarn.internal.YarnShutdownApplication.applicationId", "application_1395058039949_0052");
    app.appProperties(appProperties);
    String info = app.run();
    System.out.println(info);
}
```

Shutdown functionality is based on Boot shutdown endpoint which can be used to instruct shutdown of the running application context and thus shutdown of a whole running application instance. This endpoint is considered to be a sensitive and thus is disabled by default.

To enable this functionality shutdown endpoint needs to be enabled on both appmaster and containers. Addition to that a special containerregister needs to be enabled on appmaster for containers to be able to register itself to appmaster. Below config examples shows how do this.

for appmaster config.

```
endpoints:
    shutdown:
    enabled: true

spring:
    yarn:
    endpoints:
        containerregister:
        enabled: true
```

for container config.

```
endpoints:
shutdown:
enabled: true
```

Using YarnContainerClusterApplication

YarnContainerClusterApplication is a simple Boot application which knows how to talk with Container Cluster MVC Endpoint. More information about this see javadocs for commands introduced in below chapter.

Cli Integration

Due to nature of being a foundational library, Spring YARN doesn't provide a generic purpose client out of a box for communicating with your application. Reason for this is that Spring YARN is not a product, but an application build on top of Spring YARN would be a product which could have its own client. There is no good way of doing a generic purpose 'client' which would suit every needs and anyway user may want to customize how client works and how his own code is packaged.

We've made it as simple as possible to create your own client which can be used to control applications on YARN and if container clustering is enabled a similar utility classes can be used to control it. Only thing what is left for the end user to implement is defining which commands should be enabled.

Client facing component *spring-yarn-boot-cli* contains implementation based on *spring-boot-cli* which can be used to build application cli's. It also container built-in commands which are easy to re-use or extend.

Example above shows a typical main method to use all built-in commands.

```
public class ClientApplication extends AbstractCli {
  public static void main(String... args) {
   List<Command> commands = new ArrayList<Command>();
    commands.add(new YarnPushCommand());
   commands.add(new YarnPushedCommand());
   commands.add(new YarnSubmitCommand());
   commands.add(new YarnSubmittedCommand());
    commands.add(new YarnKillCommand());
   commands.add(new YarnShutdownCommand());
   commands.add(new YarnClustersInfoCommand());
   commands.add(new YarnClusterInfoCommand());
   commands.add(new YarnClusterCreateCommand());
   commands.add(new YarnClusterStartCommand());
   commands.add(new YarnClusterStopCommand());
   commands.add(new YarnClusterModifyCommand());
    commands.add(new YarnClusterDestroyCommand());
   ClientApplication app = new ClientApplication();
   app.registerCommands(commands);
   app.registerCommand(new ShellCommand(commands));
    app.doMain(args);
}
```

Build-in Commands

Built-in commands can be used to either control YARN applications or container clusters. All commands are under a package org.springframework.yarn.boot.cli.

Push Application

YarnPushCommand can be used to push an application into hdfs.

List Pushed Applications

```
java -jar <jar> pushed - List pushed applications
usage: java -jar <jar> pushed [options]
No options specified
```

YarnPushedCommand can be used to list information about an pushed applications.

Submit Application

YarnSubmitCommand can be used to submit a new application instance.

List Submitted Applications

YarnSubmittedCommand can be used to list info about an submitted applications.

Kill Application

YarnKillCommand can be used to kill a running application instance.

Shutdown Application

YarnShutdownCommand can be used to gracefully shutdown a running application instance.

Important

See configuration requirements from the section called "Using YarnShutdownApplication".

List Clusters Info

YarnClustersInfoCommand can be used to list info about existing clusters.

List Cluster Info

YarnClusterInfoCommand can be used to list info about a cluster.

Create Container Cluster

YarnClusterCreateCommand can be used to create a new cluster.

Start Container Cluster

 ${\tt YarnClusterStartCommand} \ \textbf{can} \ \textbf{be} \ \textbf{used} \ \textbf{to} \ \textbf{start} \ \textbf{an} \ \textbf{existing} \ \textbf{cluster}.$

Stop Container Cluster

 ${\tt YarnClusterStopCommand} \ \textbf{can be used to stop an existing cluster}.$

Modify Container Cluster

YarnClusterModifyCommand can be used to modify an existing cluster.

Destroy Container Cluster

YarnClusterDestroyCommand can be used to destroy an existing cluster.

Implementing Command

There are few different implement custom command. Αt ways to а need а lowest level org.springframework.boot.cli.command.Command to implemented all commands to be used. Spring be by boot provides classes named org.springframework.boot.cli.command.AbstractCommand and org.springframework.boot.cli.command.OptionParsingCommand to easy with command implementation. ΑII Spring YARN Boot Cli commands are based on org.springframework.yarn.boot.cli.AbstractApplicationCommand which makes it easier to execute a boot based application context.

```
public class MyCommand extends AbstractCommand {
   public MyCommand() {
      super("command name", "command desc");
   }
   public ExitStatus run(String... args) throws InterruptedException {
      // do something
      return ExitStatus.OK;
   }
```

Above you can see the mostly simplistic command example.

```
public class MyCommand extends AbstractCommand {
 public MyCommand() {
   super("command name", "command desc", new MyOptionHandler());
 public static class MyOptionHandler
     extends ApplicationOptionHandler<String> {
   protected void runApplication(OptionSet options)
       throws Exception {
     handleApplicationRun(new MyApplication());
  }
  public static class MyApplication
     extends AbstractClientApplication<String, MyApplication> {
   @Override
   public String run(String... args) {
     SpringApplicationBuilder builder = new SpringApplicationBuilder();
     builder.web(false);
     builder.sources(MyApplication.class);
     SpringApplicationTemplate template = new SpringApplicationTemplate(builder);
     return template.execute(new SpringApplicationCallback<String>() {
       public String runWithSpringApplication(ApplicationContext context)
           throws Exception {
          // do something
         return "Hello from my command";
     }, args);
   @Override
   protected MyApplication getThis() {
     return this;
  }
}
```

Above example is more sophisticated command example where the actual function of a command is done within a runWithSpringApplication template callback which allows command to interact with Spring ApplicationContext.

Using Shell

While all commands can be used as is using an executable jar, there is a little overhead for bootstrapping jvm and Boot application context. To overcome this problem all commands can be used within a shell instance. Shell also brings you a command history and all commands are executed faster because a whole jvm and its libraries are already loaded.

Special command org.springframework.yarn.boot.cli.shell.ShellCommand can be used to register an internal shell instance which is reusing all other registered commands.

14. Testing Support

Hadoop testing has always been a cumbersome process especially if you try to do testing phase during the normal project build process. Traditionally developers have had few options like running Hadoop cluster either as a local or pseudo-distributed mode and then utilise that to run MapReduce jobs. Hadoop project itself is using a lot of mini clusters during the tests which provides better tools to run your code in an isolated environment.

Spring Hadoop and especially its Yarn module faced similar testing problems. Spring Hadoop provides testing facilities order to make testing on Hadoop much easier especially if code relies on Spring Hadoop itself. These testing facilities are also used internally to test Spring Hadoop, although some test cases still rely on a running Hadoop instance on a host where project build is executed.

Two central concepts of testing using Spring Hadoop is, firstly fire up the mini cluster and secondly use the configuration prepared by the mini cluster to talk to the Hadoop components. Now let's go through the general testing facilities offered by Spring Hadoop.

Testing for MapReduce and Yarn in Spring Hadoop is separated into different packages mostly because these two components doesn't have hard dependencies with each others. You will see a lot of similarities when creating tests for MapReduce and Yarn.

14.1 Testing MapReduce

Mini Clusters for MapReduce

Mini clusters usually contain testing components from a Hadoop project itself. These are clusters for *MapReduce Job* handling and *HDFS* which are all run within a same process. In Spring Hadoop mini clusters are implementing interface HadoopCluster which provides methods for lifecycle and configuration. *Spring Hadoop* provides transitive maven dependencies against different *Hadoop* distributions and thus mini clusters are started using different implementations. This is mostly because we want to support *HadoopV1* and *HadoopV2* at a same time. All this is handled automatically at runtime so everything should be transparent to the end user.

```
public interface HadoopCluster {
   Configuration getConfiguration();
   void start() throws Exception;
   void stop();
   FileSystem getFileSystem() throws IOException;
}
```

Currently one implementation named *StandaloneHadoopCluster* exists which supports simple cluster type where a number of nodes can be defined and then all the nodes will contain utilities for *MapReduce Job* handling and *HDFS*.

There are few ways how this cluster can be started depending on a use case. It is possible to use StandaloneHadoopCluster directly or configure and start it through HadoopClusterFactoryBean. Existing HadoopClusterManager is used in unit tests to cache running clusters.

Note

It's advisable not to use HadoopClusterManager outside of tests because literally it is using static fields to cache cluster references. This is a same concept used in *Spring Test* order to cache application contexts between the unit tests within a jvm.

Example above defines a bean named *hadoopCluster* using a factory bean HadoopClusterFactoryBean. It defines a simple one node cluster which is started automatically.

Configuration

Spring Hadoop components usually depend on Hadoop configuration which is then wired into these components during the application context startup phase. This was explained in previous chapters so we don't go through it again. However this is now a catch-22 because we need the configuration for the context but it is not known until mini cluster has done its startup magic and prepared the configuration with correct values reflecting current runtime status of the cluster itself. Solution for this is to use other bean named ConfigurationDelegatingFactoryBean which will simply delegate the configuration request into the running cluster.

In the above example we created a bean named hadoopConfiguredConfiguration using ConfigurationDelegatingFactoryBean which simple delegates to hadoopCluster bean. Returned bean hadoopConfiguredConfiguration is type of Hadoop's Configuration object so it could be used as it is.

Latter part of the example show how *Spring Hadoop* namespace is used to create another Configuration object which is using *hadoopConfiguredConfiguration* as a reference. This scenario would make sense if there is a need to add additional configuration options into running configuration used by other components. Usually it is suiteable to use cluster prepared configuration as it is.

Simplified Testing

It is perfectly all right to create your tests from scratch and for example create the cluster manually and then get the runtime configuration from there. This just needs some boilerplate code in your context configuration and unit test lifecycle.

Spring Hadoop adds additional facilities for the testing to make all this even easier.

```
@RunWith(SpringJUnit4ClassRunner.class)
public abstract class AbstractHadoopClusterTests implements ApplicationContextAware {
    ...
}

@ContextConfiguration(loader=HadoopDelegatingSmartContextLoader.class)
@MiniHadoopCluster
public class ClusterBaseTestClassTests extends AbstractHadoopClusterTests {
    ...
}
```

Above example shows the AbstractHadoopClusterTests and how ClusterBaseTestClassTests is prepared to be aware of a mini cluster. HadoopDelegatingSmartContextLoader offers same base functionality as the default DelegatingSmartContextLoader in a spring-test package. One additional thing what HadoopDelegatingSmartContextLoader does is to automatically handle running clusters and inject Configuration into the application context.

```
@MiniHadoopCluster(configName="hadoopConfiguration", clusterName="hadoopCluster", nodes=1, id="default")
```

Generally @MiniHadoopCluster annotation allows you to define injected bean name for mini cluster, its Configurations and a number of nodes you like to have in a cluster.

Spring Hadoop testing is dependent of general facilities of Spring Test framework meaning that everything what is cached during the test are reuseable withing other tests. One need to understand that if Hadoop mini cluster and its Configuration is injected into an Application Context, caching happens on a mercy of a Spring Testing meaning if a test Application Context is cached also mini cluster instance is cached. While caching is always prefered, one needs to understant that if tests are expecting vanilla environment to be present, test context should be dirtied using @DirtiesContext annotation.

Wordcount Example

Let's study a proper example of existing *MapReduce Job* which is executed and tested using *Spring Hadoop*. This example is the Hadoop's classic wordcount. We don't go through all the details of this example because we want to concentrate on testing specific code and configuration.

```
<context:property-placeholder location="hadoop.properties" />
<hdp:job id="wordcountJob"
 input-path="${wordcount.input.path}"
 output-path="${wordcount.output.path}"
 libs="file:build/libs/mapreduce-examples-wordcount-*.jar"
 mapper="org.springframework.data.hadoop.examples.TokenizerMapper"
 reducer="org.springframework.data.hadoop.examples.IntSumReducer" />
<hdp:script id="setupScript" location="copy-files.groovy">
 <hdp:property name="localSourceFile" value="data/nietzsche-chapter-1.txt" />
 <hdp:property name="inputDir" value="${wordcount.input.path}" />
 <hdp:property name="outputDir" value="${wordcount.output.path}" />
</hdp:script>
<hdp:job-runner id="runner"
 run-at-startup="false"
 kill-job-at-shutdown="false"
 wait-for-completion="false"
 pre-action="setupScript"
 job-ref="wordcountJob" />
```

In above configuration example we can see few differences with the actual runtime configuration. Firstly you can see that we didn't specify any kind of configuration for hadoop. This is because it's is injected automatically by testing framework. Secondly because we want to explicitly wait the job to be run and finished, *kill-job-at-shutdown* and *wait-for-completion* are set to *false*.

```
@ContextConfiguration(loader=HadoopDelegatingSmartContextLoader.class)
@MiniHadoopCluster
public class WordcountTests extends AbstractMapReduceTests {
  @Test
 public void testWordcountJob() throws Exception {
   // run blocks and throws exception if job failed
   JobRunner runner = getApplicationContext().getBean("runner", JobRunner.class);
   Job wordcountJob = getApplicationContext().getBean("wordcountJob", Job.class);
   JobStatus finishedStatus = waitFinishedStatus(wordcountJob, 60, TimeUnit.SECONDS);
   assertThat(finishedStatus, notNullValue());
    // get output files from a job
   Path[] outputFiles = getOutputFilePaths("/user/gutenberg/output/word/");
    assertEquals(1, outputFiles.length);
    assertThat(getFileSystem().getFileStatus(outputFiles[0]).getLen(), \ greaterThan(01)); \\
    // read through the file and check that line with
      "themselves 6" was found
   boolean found = false;
   InputStream in = getFileSystem().open(outputFiles[0]);
   BufferedReader reader = new BufferedReader(new InputStreamReader(in));
    String line = null;
   while ((line = reader.readLine()) != null) {
     if (line.startsWith("themselves")) {
       assertThat(line, is("themselves\t6"));
        found = true;
   reader.close();
    assertThat("Keyword 'themselves' not found", found);
}
```

In above unit test class we simply run the job defined in xml, explicitly wait it to finish and then check the output content from *HDFS* by searching expected strings.

14.2 Testing Yarn

Mini Clusters for Yarn

Mini cluster usually contain testing components from a *Hadoop* project itself. These are MiniYARNCluster for Resource Manager and MiniDFSCluster for Datanode and Namenode which are all run within a same process. In *Spring Hadoop* mini clusters are implementing interface YarnCluster which provides methods for lifecycle and configuration.

```
public interface YarnCluster {
   Configuration getConfiguration();
   void start() throws Exception;
   void stop();
   File getYarnWorkDir();
}
```

Currently one implementation named StandaloneYarnCluster exists which supports simple cluster type where a number of nodes can be defined and then all the nodes will have *Yarn Node Manager* and *Hdfs Datanode*, additionally a *Yarn Resource Manager* and *Hdfs Namenode* components are started.

There are few ways how this cluster can be started depending on a use case. It is possible to use StandaloneYarnCluster directly or configure and start it through YarnClusterFactoryBean. Existing YarnClusterManager is used in unit tests to cache running clusters.

Note

It's advisable not to use YarnClusterManager outside of tests because literally it is using static fields to cache cluster references. This is a same concept used in *Spring Test* order to cache application contexts between the unit tests within a jvm.

Example above defines a bean named *yarnCluster* using a factory bean YarnClusterFactoryBean. It defines a simple one node cluster which is started automatically. Cluster working directories would then exist under below paths:

```
target/YarnClusterTests/
target/YarnClusterTests-dfs/
```

Note

We rely on base classes from a *Hadoop* distribution and target base directory is hardcoded in Hadoop and is not configurable.

Configuration

Spring Yarn components usually depend on *Hadoop* configuration which is then wired into these components during the application context startup phase. This was explained in previous chapters so we don't go through it again. However this is now a catch-22 because we need the configuration for the context but it is not known until mini cluster has done its startup magic and prepared the configuration with correct values reflecting current runtime status of the cluster itself. Solution for this is to use other factory bean class named ConfigurationDelegatingFactoryBean which will simple delegate the configuration request into the running cluster.

In the above example we created a bean named *yarnConfiguredConfiguration* using ConfigurationDelegatingFactoryBean which simple delegates to *yarnCluster* bean. Returned bean *yarnConfiguredConfiguration* is type of *Hadoop's* Configuration object so it could be used as it is.

Latter part of the example show how *Spring Yarn* namespace is used to create another Configuration object which is using *yarnConfiguredConfiguration* as a reference. This scenario would make sense if there is a need to add additional configuration options into running configuration used by other components. Usually it is suiteable to use cluster prepared configuration as it is.

Simplified Testing

It is perfectly all right to create your tests from scratch and for example create the cluster manually and then get the runtime configuration from there. This just needs some boilerplate code in your context configuration and unit test lifecycle.

Spring Hadoop adds additional facilities for the testing to make all this even easier.

```
@RunWith(SpringJUnit4ClassRunner.class)
public abstract class AbstractYarnClusterTests implements ApplicationContextAware {
    ...
}

@ContextConfiguration(loader=YarnDelegatingSmartContextLoader.class)
@MiniYarnCluster
public class ClusterBaseTestClassTests extends AbstractYarnClusterTests {
    ...
}
```

Above example shows the AbstractYarnClusterTests and how ClusterBaseTestClassTests is prepared to be aware of a mini cluster. YarnDelegatingSmartContextLoader offers same base functionality as the default DelegatingSmartContextLoader in a spring-test package. One additional thing what YarnDelegatingSmartContextLoader does is to automatically handle running clusters and inject Configuration into the application context.

```
@MiniYarnCluster(configName="yarnConfiguration", clusterName="yarnCluster", nodes=1, id="default")
```

Generally @MiniYarnCluster annotation allows you to define injected bean names for mini cluster, its Configurations and a number of nodes you like to have in a cluster.

Spring Hadoop Yarn testing is dependant of general facilities of Spring Test framework meaning that everything what is cached during the test are reuseable withing other tests. One need to understand that if Hadoop mini cluster and its Configuration is injected into an Application Context, caching happens on a mercy of a Spring Testing meaning if a test Application Context is cached also mini cluster instance is cached. While caching is always prefered, one needs to understant that if tests are expecting vanilla environment to be present, test context should be dirtied using @DirtiesContext annotation.

Spring Test Context configuration works exactly like you'd work with any other Spring Test based tests. It defaults on finding xml based config and fall back to Annotation based config. For example if one is working with JavaConfig a simple static configuration class can be used within the test class.

For test cases where additional context configuration is not needed a simple helper annotation @MiniYarnClusterTest can be used.

In above example a simple test case was created using annontation @MiniYarnClusterTest Behind a scenes it's using junit and prepares a YARN minicluster for you and injects needed configuration for you.

Drawback of using a composed annotation like this is that the @Configuration is then applied from an annotation class itself and user can't no longer add a static @Configuration class in a test class itself and expect Spring to pick it up from there which is a normal behaviour in Spring testing support. If user wants to use a simple composed annotation and use a custom @Configuration, one can simply duplicate functionality of this @MiniYarnClusterTest annotation.

```
@Retention(RetentionPolicy.RUNTIME)
@Target(ElementType.TYPE)
@ContextConfiguration(loader=YarnDelegatingSmartContextLoader.class)
@MiniYarnCluster
public @interface CustomMiniYarnClusterTest {
 @Configuration
 public static class Config {
   public String myCustomBean() {
     return "myCustomBean";
 }
}
@RunWith(SpringJUnit4ClassRunner.class)
@CustomMiniYarnClusterTest
public class ComposedAnnotationTests {
 private ApplicationContext ctx;
 @Test
 public void testBean() {
   assertTrue(ctx.containsBean("myCustomBean"));
}
```

In above example a custom composed annotation @CustomMiniYarnClusterTestwas created and then used within a test class. This a great way to put your configuration is one place and still keep your test class relatively non-verbose.

Multi Context Example

Let's study a proper example of existing Spring Yarn application and how this is tested during the build process. Multi Context Example is a simple Spring Yarn based application which simply launches Application Master and four Containers and withing those containers a custom code is executed. In this case simply a log message is written.

In real life there are different ways to test whether Hadoop Yarn application execution has been succesful or not. The obvious method would be to check the application instance execution status reported by Hadoop Yarn. Status of the execution doesn't always tell the whole truth so i.e. if application is about to write something into HDFS as an output that could be used to check the proper outcome of an execution.

This example doesn't write anything into HDFS and anyway it would be out of scope of this document for obvious reason. It is fairly straightforward to check file content from HDFS. One other interesting method is simply to check to application log files that being the Application Master and Container logs. Test methods can check exceptions or expected log entries from a log files to determine whether test is successful or not.

In this chapter we don't go through how Multi Context Example is configured and what it actually does, for that read the documentation about the examples. However we go through what needs to be done order to test this example application using testing support offered by Spring Hadoop.

In this example we gave instructions to copy library dependencies into Hdfs and then those entries were used within resouce localizer to tell Yarn to copy those files into Container working directory. During the unit testing when mini cluster is launched there are no files present in Hdfs because cluster is initialized

from scratch. Furtunalety Spring Hadoop allows you to copy files into Hdfs during the localization process from a local file system where Application Context is executed. Only thing we need is the actual library files which can be assembled during the build process. Spring Hadoop Examples build system rely on Gradle so collecting dependencies is an easy task.

```
<yarn:localresources>
  <yarn:hdfs path="/app/multi-context/*.jar"/>
  <yarn:hdfs path="/lib/*.jar"/>
  </yarn:localresources>
```

Above configuration exists in application-context.xml and appmaster-context.xml files. This is a normal application configuration expecting static files already be present in Hdfs. This is usually done to minimize latency during the application submission and execution.

```
<yarn:localresources>
  <yarn:copy src="file:build/dependency-libs/*" dest="/lib/"/>
  <yarn:copy src="file:build/libs/*" dest="/app/multi-context/"/>
  <yarn:hdfs path="/app/multi-context/*.jar"/>
  <yarn:hdfs path="/lib/*.jar"/>
  </yarn:localresources>
```

Above example is from MultiContextTest-context.xml which provides the runtime context configuration talking with mini cluster during the test phase.

When we do context configuration for YarnClient during the testing phase all we need to do is to add copy elements which will transfer needed libraries into Hdfs before the actual localization process will fire up. When those files are copied into Hdfs running in a mini cluster we're basically in a same point if using a real Hadoop cluster with existing files.

Note

Running tests which depends on copying files into Hdfs it is mandatory to use build system which is able to prepare these files for you. You can't do this within IDE's which have its own ways to execute unit tests.

The complete example of running the test, checking the application execution status and finally checking the expected state of log files:

```
@ContextConfiguration(loader=YarnDelegatingSmartContextLoader.class)
@MiniYarnCluster
public class MultiContextTests extends AbstractYarnClusterTests {
  @Timed(millis=70000)
 public void testAppSubmission() throws Exception {
   YarnApplicationState state = submitApplicationAndWait();
   assertNotNull(state);
   assertTrue(state.equals(YarnApplicationState.FINISHED));
   File workDir = getYarnCluster().getYarnWorkDir();
    PathMatchingResourcePatternResolver resolver = new PathMatchingResourcePatternResolver();
   String locationPattern = "file:" + workDir.getAbsolutePath() + "/**/*.std*";
    Resource[] resources = resolver.getResources(locationPattern);
    // appmaster and 4 containers should
    // make it 10 log files
   assertThat(resources, notNullValue());
   assertThat(resources.length, is(10));
    for (Resource res : resources) {
     File file = res.getFile();
     if (file.getName().endsWith("stdout")) {
        // there has to be some content in stdout file
       assertThat(file.length(), greaterThan(01));
       if (file.getName().equals("Container.stdout")) {
         Scanner scanner = new Scanner(file);
          String content = scanner.useDelimiter("\\A").next();
         scanner.close();
          // this is what container will log in stdout
         assertThat(content, containsString("Hello from MultiContextBeanExample"));
      } else if (file.getName().endsWith("stderr")) {
        // can't have anything in stderr files
       assertThat(file.length(), is(01));
   }
  }
```

14.3 Testing Boot Based Applications

In previous sections we showed a generic concepts of unit testing in *Spring Hadoop* and *Spring YARN*. We also have a first class support for testing *Spring Boot* based applications made for YARN.

```
@MiniYarnClusterTest
public class AppTests extends AbstractBootYarnClusterTests {
 public void testApp() throws Exception {
   ApplicationInfo info = submitApplicationAndWait(ClientApplication.class, new String[0]);
   {\tt assertThat(info.getYarnApplicationState(), is(YarnApplicationState.FINISHED));} \\
   List<Resource> resources = ContainerLogUtils.queryContainerLogs(
     getYarnCluster(), info.getApplicationId());
   assertThat(resources, notNullValue());
   assertThat(resources.size(), is(4));
   for (Resource res : resources) {
     File file = res.getFile();
     String content = ContainerLogUtils.getFileContent(file);
      if (file.getName().endsWith("stdout")) {
       assertThat(file.length(), greaterThan(01));
       if (file.getName().equals("Container.stdout")) {
         assertThat(content, containsString("Hello from HelloPojo"));
     } else if (file.getName().endsWith("stderr")) {
       assertThat("stderr with content: " + content, file.length(), is(01));
   }
  }
}
```

Let's go through step by step what's happening in this JUnit class. As already mentioned earlier we don't need any existing or running Hadoop instances, instead testing framework from Spring YARN provides an easy way to fire up a mini cluster where your tests can be run in an isolated environment.

- @ContextConfiguration together with YarnDelegatingSmartContextLoader tells Spring to prepare a
 testing context for a mini cluster. EmptyConfig is a simple helper class to use if there are no additional
 configuration for tests.
- @MiniYarnCluster tells Spring to start a Hadoop's mini cluster having components for HDFS and YARN. Hadoop's configuration from this minicluster is automatically injected into your testing context.
- @MiniYarnClusterTest is basically a replacement of @MiniYarnCluster and @ContextConfiguration having an empty context configuration.
- AbstractBootYarnClusterTests is a class containing a lot of base functionality what you need in your tests.

Then it's time to deploy the application into a running minicluster

- submitApplicationAndWait() method simply runs your ClientApplication and expects it to an application deployment. On default it will wait 60 seconds an application to finish and returns an current state.
- We make sure that we have a correct application state

We use ContainerLogUtils to find our container logs files from a minicluster.

- · We assert count of a log files
- · We expect some specified content from log file
- · We expect stderr files to be empty

Part III. Developing Spring for Apache Hadoop Applications

This section provides some guidance on how one can use the Spring for Apache Hadoop project in conjunction with other Spring projects, starting with the Spring Framework itself, then Spring Batch, and then Spring Integration.

15. Guidance and Examples

Spring for Apache Hadoop provides integration with the Spring Framework to create and run Hadoop MapReduce, Hive, and Pig jobs as well as work with HDFS and HBase. If you have simple needs to work with Hadoop, including basic scheduling, you can add the Spring for Apache Hadoop namespace to your Spring based project and get going quickly using Hadoop.

As the complexity of your Hadoop application increases, you may want to use Spring Batch to regain on the complexity of developing a large Hadoop application. Spring Batch provides an extension to the Spring programming model to support common batch job scenarios characterized by the processing of large amounts of data from flat files, databases and messaging systems. It also provides a workflow style processing model, persistent tracking of steps within the workflow, event notification, as well as administrative functionality to start/stop/restart a workflow. As Spring Batch was designed to be extended, Spring for Apache Hadoop plugs into those extensibilty points, allowing for Hadoop related processing to be a first class citizen in the Spring Batch processing model.

Another project of interest to Hadoop developers is Spring Integration. Spring Integration provides an extension of the Spring programming model to support the well-known Enterprise Integration Patterns. It enables lightweight messaging within Spring-based applications and supports integration with external systems via declarative adapters. These adapters are of particular interest to Hadoop developers, as they directly support common Hadoop use-cases such as polling a directory or FTP folder for the presence of a file or group of files. Then once the files are present, a message is sent internally to the application to do additional processing. This additional processing can be calling a Hadoop MapReduce job directly or starting a more complex Spring Batch based workflow. Similarly, a step in a Spring Batch workflow can invoke functionality in Spring Integration, for example to send a message though an email adapter.

No matter if you use the Spring Batch project with the Spring Framework by itself or with additional extentions such as Spring Batch and Spring Integration that focus on a particular domain, you will benefit from the core values that Spring projects bring to the table, namely enabling modularity, reuse and extensive support for unit and integration testing.

15.1 Scheduling

Spring Batch integrates with a variety of job schedulers and is not a scheduling framework. There are many good enterprise schedulers available in both the commercial and open source spaces such as Quartz, Tivoli, Control-M, etc. It is intended to work in conjunction with a scheduler, not replace a scheduler. As a lightweight solution, you can use Spring's built in scheduling support that will give you cron-like and other basic scheduling trigger functionality. See the <u>Task Execution and Scheduling</u> documention for more info. A middle ground it to use Spring's Quartz integration, see <u>Using the OpenSymphony Quartz Scheduler</u> for more information. The Spring Batch distribution contains an example, but this documentation will be updated to provide some more directed examples with Hadoop, check for updates on the <u>main web site of Spring for Apache Hadoop</u>.

15.2 Batch Job Listeners

Spring Batch lets you attach listeners at the job and step levels to perform additional processing. For example, at the end of a job you can perform some notification or perhaps even start another Spring Batch job. As a brief example, implement the interface <u>JobExecutionListener</u> and configure it into the Spring Batch job as shown below.

16. Other Samples

The sample applications have been moved into their own repository so they can be developed independently of the Spring for Apache Hadoop release cycle. They can be found on GitHub https://github.com/spring-projects/spring-hadoop-samples/.

We also keep a numerous Spring IO getting started guides up to date with a latest GA release at https://spring.io/guides?filter=yarn.

The <u>wiki page</u> for the Spring for Apache Hadoop project has more documentation for building and running the examples and there is also some instructions in the *README* file of each example.

Part IV. Other Resources

In addition to this reference documentation, there are a number of other resources that may help you learn how to use Hadoop and Spring framework. These additional, third-party resources are enumerated in this section.

17. Useful Links

- Spring for Apache Hadoop Home Page
- Spring Data Home Page
- Spring Data Book Home Page
- Spring Blog
- Apache Hadoop Home Page
- Pivotal HD Home Page