Running Spark on Nomad

Spark supports using a Nomad cluster to run Spark applications. When running on nomad, the Spark executors that run Spark tasks for your application, and optionally the application driver itself, run as Nomad tasks in a Nomad job.

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Launching Spark on Nomad

To launch a Spark application on Nomad, set the Spark master to either "nomad:" followed by the URL for the Nomad HTTP API (e.g. "nomad:http://nomad.example.com:4646"), or simply "nomad" to use the URL in NOMAD_ADDR environment variable or "http://127.0.0.1:4646" when that variable is not set.

When using spark-submit, the master is set with the --master option. In general, your spark-submit invocation will have the form:

\$ bin/spark-submit --master nomad[:<url>] [options] --class <main-class> <jar> [args]

When running your application directly (which limits you to client mode), you can set the master with the spark.master configuration property, or using the SparkConf.setMaster on the configuration you create your SparkContext from.

Prerequisites

When running on Nomad, Spark creates Nomad tasks that run scripts from the Spark distribution on client agents in the Nomad cluster. These tasks need access to a Java runtime environment (JRE), a Spark distribution built with Nomad support, and (in cluster mode) the Spark application itself.

Installed JRE or Docker Image

By default, Spark will constrain the tasks it creates to run on Nomad client agents which have the java driver enabled and at least Java 7. The tasks use Nomad's exec driver to run Spark scripts on those nodes, and the scripts make use of the JRE that is installed on the node.

Alternatively, you can set the spark.nomad.dockerImage configuration property to the name or URL of a docker image to use to run Spark Nomad tasks. The tasks use Nomad's docker driver to run Spark scripts in a container created from this image. The image should contain a JRE, and optionally a Spark distribution (see below). When using this option, you can set the spark.nomad.dockerAuth configuration property to a JSON object that provides authentication configuration for Nomad's docker driver.

Note that when using a Docker image, you may want to include the Spark distribution directly in the docker image, you may want to include the Spark distribution (see the section below) and possibly even your application in the docker image and use local: URLs when giving their locations to spark-submit.

Spark Distribution Location

The Nomad tasks created by Spark need to have access to a Spark distribution, and the spark.nomad.sparkDistribution configuration property must be set to a URL where the spark distribution can be found.

When a local: URL is provided, it must point to a directory containing a spark distribution. When spark.nomad.dockerImage is set (see Installed JRE or Docker Image above), this designates a path inside the docker image. Otherwise it is a path on the Nomad client node itself (meaning that Spark must be installed at this location on all clients in the Nomad cluster that have at least Java 7 and meet any additional constraints you specify).

E.g.:

```
$ ./bin/spark-submit \
    --master nomad \
    --conf spark.nomad.dockerImage=your-spark-image \
    --conf spark.nomad.sparkDistribution=local:///opt/spark \
    --class com.example.Main \
    example.jar
```

Alternatively, you can provide the remote URL of a Spark distribution archive. The archive will be downloaded and extracted into the task's allocation directory.

E.g.:

```
$ ./bin/spark-submit \
    --master nomad \
    --conf spark.nomad.sparkDistribution=http://example.com/spark.tgz \
    --class com.example.Main \
    example.jar
```

Deployment Modes

You can run a Spark application on Nomad in either "client" mode (the default) or "cluster" mode.

Client Mode

In client mode (the default deployment mode), the Spark application is either directly started by the user, or run directly by sparksubmit, so the application driver runs on a machine that is not necessarily in the Nomad cluster. The driver's SparkContext creates a Nomad job to run Spark executors. The executors connect to the driver and run Spark tasks on behalf of the application. When the driver's SparkContext is stopped, the executors are shut down.



Note that the machine running the driver or spark-submit needs to be reachable from the Nomad clients so that the executors can connect to it.

In client mode, application resources need to start out present on the submitting machine, so jars (both the primary jar and those added with the --jars option) can't be specified using http: or https: URLs. You can either use files on the submitting machine

(either as raw paths or file: URLs), or use local: URLs to indicate that the files are independently available on both the submitting machine and all of the Nomad clients where the executors might run.

In this mode, the spark-submit invocation doesn't return until the application has finished running, and killing the spark-submit process kills the application.

For example, to submit an application in client mode:

```
$ ./bin/spark-submit --class org.apache.spark.examples.SparkPi \
    --master nomad \
    --conf spark.nomad.sparkDistribution=http://example.com/spark.tgz
    lib/spark-examples*.jar \
    10
```

Cluster Mode

In cluster mode, the spark-submit process creates a Nomad job to run the Spark application driver. The driver's SparkContext then adds Spark executors to the Nomad job. The executors connect to the driver and run Spark tasks on behalf of the application. When the driver's SparkContext is stopped, the executors are shut down.



In cluster mode, application resources need to be hosted somewhere accessible to the Nomad cluster, so jars (both the primary jar and those added with the --jars option) can't be specified using raw paths or file: URLs. You can either use http: or https: URLs, or use local: URLs to indicate that the files are independently available all of the Nomad clients where the driver and executors might run.

Note that in cluster mode, the nomad master URL needs to be routable from both the submitting machine and the Nomad client node that runs the driver. If the Nomad cluster is integrated with Consul, you may want to use a DNS name for the Nomad service served by Consul.

For example, to submit an application in cluster mode:

```
$ ./bin/spark-submit --class org.apache.spark.examples.SparkPi \
    --master nomad \
    --deploy-mode cluster \
    --conf spark.nomad.sparkDistribution=http://example.com/spark.tgz
    http://example.com/spark-examples.jar \
    10
```

Monitoring Output

By default, spark-submit in cluster mode will simply submit your application to the Nomad cluster. You can use the spark.nomad.cluster.expectImmediateScheduling and spark.nomad.cluster.monitorUntil configuration properties to have spark-submit wait until the job is actually scheduled to run or tail its log until the job completes.

In any case, once the job has been submitted to Nomad, killing spark-submit won't stop the spark application, as it runs independently in the Nomad cluster.

Spark UI

In cluster mode, if spark.ui.enabled is true (as by default), the Spark UI will be dynamically allocated a port. The UI will be exposed by Nomad as a service, and the UI's URL will appear in the Spark driver's log.

The Spark UI stops being served when the application finishes. This can sometimes be frustrating when debugging an application. You can delay the stopping of the UI by setting spark.ui.stopDelay duration, e.g. "5m" for 5 minutes. Note that this will cause the driver process to continue running. You can force a delayed stop to proceed immediately on the "Jobs" page of the web UI, or by sending

Remote URLs

Nomad uses go-getter to download artifacts, which allows you to embed checksums in HTTP/S URLs. Using checksums is recommended, as it allows Nomad to both verify the integrity of a file, and use the checksum as a cache key to avoid redownloading unchanged files. The checksums take the form of a query string parameter of the form checksum=type:value, where type is a hash type and value is the checksum value. See the go-getter checksumming documentation for details.

Nomad Job Customization

By default, Nomad will start with a blank job, and starts adding to it. When running in cluster mode, it will add a task group for the driver, containing a task (with a "spark.nomad.role" = "driver" meta value) to run the driver. The driver then adds a task group to the job for each executor it wants to run. It will add a task (with a "spark.nomad.role" = "executor" meta value) to the executor's task group to run the executor, and if the shuffle service is enabled (as with dynamic allocation), a task (with a "spark.nomad.role" = "shuffle" meta value) to run it.

The following incomplete HCL job specification gives an idea of the structure of a Nomad job created by Spark.

```
job "structure" {
 meta {
    "spark.nomad.role" = "application"
 }
 # A driver group is only added in cluster mode
 group "driver" {
    task "driver" {
     meta {
        "spark.nomad.role" = "driver"
     }
    }
 }
 group "executor 1" {
   task "executor" {
     meta {
        "spark.nomad.role" = "executor"
     }
    }
    # shuffle service tasks are only added when enabled (as it must be when using dynamic allocation)
   task "shuffle-service" {
     meta {
        "spark.nomad.role" = "shuffle"
     }
    }
 }
 group "executor 2" {
   task "executor" {
     meta {
        "spark.nomad.role" = "executor"
     }
    }
```

```
# shuffle service tasks are only added when enabled (as it must be when using dynamic allocation)
task "shuffle-service" {
    meta {
        "spark.nomad.role" = "shuffle"
    }
    }
    # ...and so on for each executor
}
```

There are two ways to customize the Nomad job, task groups and tasks that Spark creates. You can provide a job template that Spark will use as a starting point for creating its Nomad job, allowing you to customize almost any aspect of the job. You can also set Spark configuration properties to override e.g. how many resources Spark should reserve for its Nomad tasks.

The order of precedence for settings is as follows:

- 1. Explicitly set configuration properties.
- 2. Settings in the job template if provided.
- 3. Default values of the configuration properties.

Using a Job Template

Rather than having Spark create a Nomad job from scratch to run your application, you can set the spark.nomad.job.template configuration property to the path of the file containing the JSON job template. There are two important things to note here:

- The template must be in the format of a JSON job specification. Nomad job specifications are normally written in HCL and converted to JSON by the nomad command-line tool. You can convert an HCL jobspec to JSON by running nomad run -output <job.nomad>.
- spark.nomad.job.template should be set to a path on the submitting machine, *not* to a URL (even in cluster mode). The template does not need to be accessible from driver or executors.

Using a job template you can override Spark's default resource utilization, add additional metadata or constraints, set environment variables, add sidecar tasks to the driver or executor task groups, add additional task groups of your own, etc.

When setting properties in the job Spark creates from your template, the value precedence is as follows:

- 1. Values from Spark properties
- 2. Values in the job template
- 3. Default values for Spark configuration properties

E.g. the job priority is controlled by the spark.nomad.priority configuration property, which has a default of 40. If a value is specified for that property (e.g. on the commandline, in spark-defaults.conf, etc.), that value will be used. Otherwise if the template contains a value for the priority, the template's value will be used. If neither of these sources provides a value, the default of 40 will be used.

Conceptually, this is how Spark uses the job template:

- 1. Identify the template task group for Spark executors, of which there should be at most one, as a group containing tasks with a "spark.nomad.role" meta value of "executor" or "shuffle". If there is such a group, it is removed from the job and used as a template for executors.
- 2. Identify the template task group for the Spark driver, of which there should be at most one, as a group containing a task with a "spark.nomad.role" meta value of "driver". If not running in cluster mode, this task group is removed from the job and discarded.
- 3. Proceed as normal, but using the provided job, driver task group, and executor task group template as the starting point for the task groups that are normally generated.

Here's an example of a small HCL template that sets a metadata value on the job and an environment variable for executors:

```
job "template" {
  meta {
    "foo" = "bar"
  }
  group "executor-group-name" {
    task "executor-task-name" {
}
```

```
meta {
    "spark.nomad.role" = "executor"
    }
    env {
        BAZ = "something"
    }
    }
}
```

Note that this is only a partial jobspec and not fully runnable. But it is a valid template, and can be converted to JSON with nomad run -output <hcl-jobspec.nomad>. The job name is always set at runtime, so the "template" name is just a syntactically necessary placeholder and will be overridden. Also note that it is the "spark.nomad.role" = "executor" meta value on the driver task that tells Spark that the "driver-group-name" task group is the template for executors; the names of the group and task can be whatever you like; when the executor task group is instantiated, the executor id will be appended to the name, resulting in "driver-group-name 1", "driver-group-name 2", etc.

Resource Allocation

Resource allocation can be configured using a job template or through configuration properties.

Configuring resources using a template would look something like this (this HCL syntax; see the section above on converting this to JSON):

```
job "template" {
  group "group-name" {
   task "task-name" {
      meta {
       "spark.nomad.role" = "role" # this would be "driver", "executor", or "shuffle", as appropriate
      }
      resources {
        cpu = 2000
        memory = 2048
        network {
          mbits = 100
        }
      }
    }
  }
}
```

Resource-related configuration properties are covered below:

Memory

The standard Spark memory properties will be propagated to Nomad to control task resource allocation: spark.driver.memory (set by spark-submit's --driver-memory flag) and spark.executor.memory (set by spark-submit's --executor-memory flag). You can additionally specify spark.nomad.shuffle.memory to control how much memory Nomad allocates to shuffle service tasks.

CPU

Spark sizes its thread pools and allocates tasks based on the number of CPU cores available. Nomad manages CPU allocation in terms of processing speed rather than number of cores.

When running Spark on Nomad, you can control how much CPU share Nomad will allocate to tasks using spark.nomad.driver.cpu, spark.nomad.executor.cpu and spark.nomad.shuffle.cpu.

When running on Nomad, executors will be configured to use one core by default, meaning they will only pull a single 1-core task at a time. You can setting the spark.executor.cores property (or spark-submit's --executor-cores flag) to allow more tasks to be executed concurrently on a single executor.

Network

Nomad doesn't restrict the network bandwidth of running tasks, bit it does allocate a non-zero number of Mbit/s to each task and uses this when bin-packing task groups onto Nomad clients. Spark defaults to requesting the minimum of 1 Mbit/s per task, but you can change this with the spark.nomad.driver.networkMBits, spark.nomad.executor.networkMBits, and spark.nomad.shuffle.networkMBits properties.

Log Rotation

Nomad performs log rotation on the stdout and stderr of its tasks. You can configure the number number and size of log files it will keep for driver and executor task groups using spark.nomad.driver.logMaxFiles and spark.nomad.executor.logMaxFiles.

Logs

Nomad clients collect the stderr and stdout of the tasks that they run, and the nomad CLI or API can be used to inspect them, as documented in Nomad's documentation on Accessing Logs.

Links to the stderr and stdout of the executors tab of the Spark UI. In cluster mode, the stderr and stdout of the driver application can be found there as well.

The Log Shipper Pattern described in the "Accessing Logs" link above uses sidecar tasks to forward logs to a central location. This can be done using a job template along the following lines:

```
job "template" {
 group "driver" {
   task "driver" {
      meta {
        "spark.nomad.role" = "driver"
      }
    }
   task "log-forwarding-sidecar" {
      # sidecar task definition here
    }
 }
 group "executor" {
   task "executor" {
      meta {
        "spark.nomad.role" = "executor"
      }
    }
   task "log-forwarding-sidecar" {
      # sidecar task definition here
    }
 }
}
```

Dynamic Allocation of Executors

By default, the Spark application will use a fixed number of executors. Setting spark.dynamicAllocation to true enables Spark to add and remove executors during execution depending on the number of Spark tasks scheduled to run. As described in Dynamic Resource Allocation, dynamic allocation requires that spark.shuffle.service.enabled be set to true.

On Nomad, setting spark.shuffle.service.enabled to true adds an additional shuffle service Nomad task to each executor's task group. This results in a one-to-one mapping of executors to shuffle services.

When the executor exits, the shuffle service continues running so that it can serve any results produced by the executor. Note that due to the way resource allocation works in Nomad, the resources allocated to the executor Nomad task aren't freed until the shuffle service is also finished, meaning that they will remain allocated until the application has finished. This may improve in the future.

Python and R

There is basic support for running Spark applications written in Python and R on Nomad, including the pyspark and sparkR interactive modes.

For example, running a python Spark application on Nomad:

```
bin/spark-submit \
    --master nomad \
    --conf spark.nomad.sparkDistribution=http://example.com/spark.tgz \
    examples/src/main/python/pi.py
```

For example, running a sparkR interactive mode with executors on Nomad:

```
bin/sparkR \
    --master nomad \
    --conf spark.nomad.sparkDistribution=http://example.com/spark.tgz
```

Note that the python or R runtime must be installed on the Nomad clients; if these are only present on some client, you can use constraints (documented above) to ensure your task groups run on these clients.

Configuration Properties

Most of the configs are the same for Spark on Nomad as for other deployment modes. See the configuration page for more information on those. These are configs that are specific to running Spark on Nomad.

Property Name	Default	Meaning
spark.executor.instances	2	The number of executors for static allocation. With spark.dynamicAllocation.enabled, the initial set of executors will be at least this large.
<pre>spark.nomad.cluster.expectImmediateScheduling</pre>	false	When true, spark-submit will fail if Nomad isn't able to schedule the jc to run right away
spark.nomad.cluster.monitorUntil		Specifies how long spark-submit should monitor a Spark application i cluster mode. submitted (the default) causes spark-submit to return a soon as the application has been submitted to the Nomad cluster. scheduled causes spark-submit to return once the Nomad job has been scheduled. complete causes spark-submit to tail the output fron the driver process and return when the job has completed.
spark.nomad.datacenters		Comma-separated list of Nomad datacenters to use (defaults to the datacenter of the first Nomad server contacted)
spark.nomad.docker.email		Email address used when downloading the docker image specified by spark.nomad.dockerImage from the docker registry. (https://www.nomadproject.io/docs/drivers/docker.html#authenticatio
spark.nomad.docker.password		Password used when downloading the docker image specified by spark.nomad.dockerImage from the docker registry. (https://www.nomadproject.io/docs/drivers/docker.html#authenticatio
spark.nomad.docker.serverAddress		Server address (domain/IP without the protocol) used when downloading the docker image specified by spark.nomad.dockerImag from the docker registry. Docker Hub is used by default. (https://www.nomadproject.io/docs/drivers/docker.html#authenticatio
spark.nomad.docker.username		Username used when downloading the docker image specified by spark.nomad.dockerImage from the docker registry. (https://www.nomadproject.io/docs/drivers/docker.html#authenticatio
spark.nomad.dockerImage		A [docker image] (https://www.nomadproject.io/docs/drivers/docker.html#image) to use

to run Spark with Nomad's docker driver. When not specified, Nomad exec driver will be used instead.

spark.nomad.driver.cpu	1000	How many MHz of CPU power Nomad should reserve for driver tasks
<pre>spark.nomad.driver.logMaxFileSize</pre>	1m	Maximum size that Nomad should keep in log files from driver tasks
<pre>spark.nomad.driver.logMaxFiles</pre>	5	Number of log files Nomad should keep from driver tasks
<pre>spark.nomad.driver.networkMBits</pre>	1	The network bandwidth Nomad should allocate to driver tasks during bin packing
<pre>spark.nomad.driver.retryAttempts</pre>	5	The number of times Nomad should retry driver task groups if they fai
<pre>spark.nomad.driver.retryDelay</pre>	15s	How long Nomad should wait before retrying driver task groups if they fail
<pre>spark.nomad.driver.retryInterval</pre>	1d	Nomad's retry interval for driver task groups
spark.nomad.executor.cpu	1000	How many MHz of CPU power Nomad should reserve for executor tasks
<pre>spark.nomad.executor.logMaxFileSize</pre>	1m	Maximum size that Nomad should keep in log files from executor task
<pre>spark.nomad.executor.logMaxFiles</pre>	5	Number of log files Nomad should keep from executor tasks
<pre>spark.nomad.executor.networkMBits</pre>	1	The network bandwidth Nomad should allocate to executor tasks during bin packing
<pre>spark.nomad.executor.retryAttempts</pre>	5	The number of times Nomad should retry executor task groups if they fail
spark.nomad.executor.retryDelay	15s	How long Nomad should wait before retrying executor task groups if they fail
<pre>spark.nomad.executor.retryInterval</pre>	1d	Nomad's retry interval for executor task groups
spark.nomad.job		The Nomad job name to use
spark.nomad.job.template		The path to a JSON file containing a Nomad job to use as a template
spark.nomad.priority		The priority of the Nomad job that runs the application or its executors
spark.nomad.region		The Nomad region to use (defaults to the region of the first Nomad server contacted)
spark.nomad.shuffle.cpu	1000	How many MHz of CPU power Nomad should reserve for shuffle service tasks
<pre>spark.nomad.shuffle.logMaxFileSize</pre>	1m	Maximum size that Nomad should keep in log files from shuffle service tasks
<pre>spark.nomad.shuffle.logMaxFiles</pre>	5	Number of log files Nomad should keep from shuffle service tasks
spark.nomad.shuffle.memory	256m	The amount of memory that Nomad should allocate for the shuffle service tasks
<pre>spark.nomad.shuffle.networkMBits</pre>	1	The network bandwidth Nomad should allocate to shuffle service task during bin packing
<pre>spark.nomad.sparkDistribution</pre>		The location of the spark distribution tgz file to use.
spark.nomad.tls.caCert		Path to a .pem file containing the certificate authority to validate the Nomad server's TLS certificate against
spark.nomad.tls.cert		Path to a .pem file containing the TLS certificate to present to the Nomad server

Path to a .pem file containing the private key corresponding to the certificate in spark.nomad.tls.cert