

KMeans, SumSVM

Iterative, CrossValidation

#### A Stage of a Pipeline defines:

- A task (and concrete configuration parameters)
- A list (hierarchy) of Task-Containers (and concrete configuration parameters)
- An input datasource
- An output datasource

#### For instance:

```
stage.01.task: bigs.modules.ml.KMeans
```

stage.01.container.01: bigs.modules.containers.IterativeTaskContainer

stage.01.container.02: bigs.modules.containers.DataPartitionTaskContainer

stage.01.input.source: bigs.modules.storage.HBaseDataSource

stage.01.input.table: dataset.CLEF2012

stage.01.output.source: bigs.modules.storage.HBaseDataSource

stage.01.output.table: models.CLEF2012

stage.01.KMeans.numberOfCentroids: 20

stage.01.Iteration.numberOfIterations: 2

stage.01.DataPartition.numberOfPartitions: 2

#### From this, BIGS

- (1) allows each TaskContainer to tag input data as desired
- (2) establishes a schedule to process all input data grouped by tags
- (3) establishes execution priorities according to whether TaskContainers are parallel or sequential
- (4) provides workers to to execute the schedule



A **Pipeline** is made of a set of consecutive **Stages** 

A schedule for a Stage is hierarchy of **TaskContainers**, each container composed of a set of identical **Tasks** 

A TaskContainer defines parameters and generic behavior placeholders for itself and its Task

Examples of TaskContainers: Iteration, DataPartition, CrossValidation

A TaskContainer defines whether it executes its blocks sequentially or in parallel

A TaskContainer also defines how input data is tagged

A **Task** defines concrete behaviour for the placeholder defined by certain TaskContainers (and not necesarily for all TaskContainers)

Examples of Tasks: KMeans, RGBFeaturesExtractor, SummationFormSVM



```
stage.01.task: pilot.modules.ml.KMeans
   stage.01.container.01: pilot.modules.containers.IterativeTaskContainer
   stage.01.container.02: pilot.modules.containers.DataPartitionTaskContainer
   stage.01.input.source: bigs.modules.storage.HBaseDataSource
   stage.01.input.table: dataset.CLEF2012
   stage.01.outpu.source: bigs.modules.storage.HBaseDataSource
   stage.01.output.table: models.CLEF2012
   stage.01.KMeans.numberOfCentroids: 20
   stage.01.IterativeTaskContainer.numberOfIterations: 3
   stage.01.DataPartitionTaskContainer.numberOfPartitions: 3
12/04/12 12:11:11 INFO bigs: RULIX Stage 1
12/04/12 12:11:11 INFO bigs: RULIX configured task: KMeans [numberOfCentroids=20]
   TopLevelTaskContainer []
        IterativeTaskContainer [numberOfIterations=3, iterationNumber=1]
             DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=1]
             DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=2]
             DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=3]
        IterativeTaskContainer [numberOfIterations=3, iterationNumber=2]
             DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=1]
             DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=2]
             DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=3]
        IterativeTaskContainer [numberOfIterations=3, iterationNumber=3]
             DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=1]
             DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=2]
             DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=3]
```



## Provided by IterativeTaskContainer implements TaskContainer

Provided by **DataPartitionTaskConatiner**implements **TaskContainer** 

```
12/04/12 12:11:11 INFO bigs: RULIX Stage 1
12/04/12 12:11:11 INFO bigs: RULIX configured task: KMeans [numberOfCentroids=20]
     TopLevelTaskContainer [].preSubContainers
000
001
        IterativeTaskContainer [numberOfIterations=3, iterationNumber=null].preMyContainers
002
            IterativeTaskContainer [numberOfIterations=3, iterationNumber=1].preSubContainers
003
               DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=null].preMyContainers
004
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=1] LOOP processDataBlock
                  DataPartitionTaskContainer [numberofPartitions=3, partitionNumber=2] LOOP processDataBlock
004
004
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=3] LOOP processDataBlock
005
               DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=null].postMyContainers
            IterativeTaskContainer [numberOfIterations=3, iterationNumber=1].postSubContainers
006
007
            IterativeTaskContainer [numberOfIterations=3, iterationNumber=2].preSubContainers
800
               DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=null].preMyContainers
009
                  DataPartitionTaskContainer [numberofPartitions=3, partitionNumber=1] LOOP processDataBlock
009
                  DataPartitionTaskContainer [numberofPartitions=3, partitionNumber=2] LOOP processDataBlock
009
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=3] LOOP processDataBlock
               DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=null].postMyContainers
010
011
            IterativeTaskContainer [numberOfIterations=3, iterationNumber=2].postSubContainers
012
            IterativeTaskContainer [numberOfIterations=3, iterationNumber=3].preSubContainers
013
               DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=null].preMyContainers
014
                  DataPartitionTaskContainer [numberofPartitions=3, partitionNumber=1] LOOP processDataBlock
                  DataPartitionTaskContainer [numberofPartitions=3, partitionNumber=2] LOOP processDataBlock
014
014
                  DataPartitionTaskContainer [numberofPartitions=3, partitionNumber=3] LOOP processDataBlock
015
               DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=null].postMyContainers
            IterativeTaskContainer [numberOfIterations=3, iterationNumber=3].postSubContainers
016
017
        IterativeTaskContainer [numberOfIterations=3, iterationNumber=null].postMyContainers
018
      TopLevelTaskContainer [].postSubContainers
```

IterativeTaskContainer declared as Sequential, DataPartitionTaskContainer declared as Parallel



```
12/04/12 14:56:41 INFO bigs: RULIX Stage 1
12/04/12 14:56:41 INFO bigs: RULIX configured task: KMeans [numberOfCentroids=20]
     TopLevelTaskContainer [].preSubContainers
000
        IterativeTaskContainer [numberOfIterations=3, iterationNumber=null].preMyContainers
001
002
            IterativeTaskContainer [numberOfIterations=3, iterationNumber=1].preSubContainers
003
               DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=null].preMyContainers
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=1] LOOP processDataItem
004
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=2] LOOP processDataItem
004
004
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=3] LOOP processDataItem
               DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=null].postMyContainers
005
            IterativeTaskContainer [numberOfIterations=3, iterationNumber=1].postSubContainers
006
002
            IterativeTaskContainer [numberOfIterations=3, iterationNumber=2].preSubContainers
               DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=null].preMyContainers
003
004
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=1] LOOP processDataItem
004
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=2] LOOP processDataItem
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=3] LOOP processDataItem
004
               DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=null].postMvContainers
005
006
            IterativeTaskContainer [numberOfIterations=3, iterationNumber=2].postSubContainers
002
            IterativeTaskContainer [numberOfIterations=3, iterationNumber=3].preSubContainers
               DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=null].preMyContainers
003
004
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=1] LOOP processDataItem
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=2] LOOP processDataItem
004
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=3] LOOP processDataItem
004
005
               DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=null].postMyContainers
            IterativeTaskContainer [numberOfIterations=3, iterationNumber=3].postSubContainers
006
007
        IterativeTaskContainer [numberOfIterations=3, iterationNumber=null].postMyContainers
      TopLevelTaskContainer [].postSubContainers
800
```



```
12/04/12 15:02:28 INFO bigs: RULIX Stage 1
12/04/12 15:02:28 INFO bigs: RULIX configured task: KMeans [numberOfCentroids=20]
     TopLevelTaskContainer [].preSubContainers
000
        IterativeTaskContainer [numberOfIterations=3, iterationNumber=null].preMyContainers
001
002
            IterativeTaskContainer [numberOfIterations=3, iterationNumber=1].preSubContainers
003
               DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=null].preMyContainers
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=1] LOOP processDataItem
004
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=2] LOOP processDataItem
005
006
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=3] LOOP processDataItem
               DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=null].postMyContainers
007
            IterativeTaskContainer [numberOfIterations=3, iterationNumber=1].postSubContainers
800
009
            IterativeTaskContainer [numberOfIterations=3, iterationNumber=2].preSubContainers
               DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=null].preMyContainers
010
011
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=1] LOOP processDataItem
012
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=2] LOOP processDataItem
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=3] LOOP processDataItem
013
               DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=null].postMvContainers
014
015
            IterativeTaskContainer [numberOfIterations=3, iterationNumber=2].postSubContainers
016
            IterativeTaskContainer [numberOfIterations=3, iterationNumber=3].preSubContainers
017
               DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=null].preMyContainers
018
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=1] LOOP processDataItem
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=2] LOOP processDataItem
019
020
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=3] LOOP processDataItem
021
               DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=null].postMyContainers
            IterativeTaskContainer [numberOfIterations=3, iterationNumber=3].postSubContainers
022
023
        IterativeTaskContainer [numberOfIterations=3, iterationNumber=null].postMyContainers
     TopLevelTaskContainer [].postSubContainers
024
```



```
12/04/12 12:11:11 INFO bigs: RULIX Stage 1
12/04/12 12:11:11 INFO bigs: RULIX configured task: KMeans [numberOfCentroids=20]
      TopLevelTaskContainer [].preSubContainers
        IterativeTaskContainer [numberOfIterations=3, iterationNumber=null].preMyContainers
001
            IterativeTaskContainer [numberOfIterations=3, iterationNumber=1].preSubContainers
002
003
               DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=null].preMyContainers
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=1] LOOP processDataItem
004
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=2] LOOP processDataItem
004
004
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=3] LOOP processDataItem
               DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=null].postMyContainers
005
            IterativeTaskContainer [numberOfIterations=3, iterationNumber=1].postSubContainers
006
```

# **WORKER LOGIC:**

Can take over the execution of any Schedule Item that:

- (1) Its parent has finished
- (2) Its siblings with lower priority have finished



**PipelineStage** 

#### methods

- fromProperties

#### fields

- configuredTask
- topTaskLevel

Task

@BIGSParam

**TaskContainer** 

@BIGSParam

#### abstract methods

- supportsParallelization
- allowedTasks
- allowedTaskContainers
- allowedTags
- processPreSubContainers
- processPostSubContainers
- processPreMyContainers
- processPostMyContainers
- processPreDataBlock
- processDataItem
- processPostDataBlock
- List<String> tagDataItem(item)

#### fields

- taskContainers (list)
- parentTaskContainer

CrossValidationTaskContainer

**DataPartitionTaskContainer** 

**IterativeTaskContainer** 



## **DATA FLOW**

### Each TaskContainer is given the chance to produce tags for the data

		Tags by IterativeTask	Container	Tags by CrossValidationTaskContainer		Tags by DataPartitionTaskContainer	
кеу	Content	Iteration 1	Iteration 2	Fold	Function	Split	e rom askeon carner
1		1	2	1	TRAIN	1	
2		1	2	1	TRAIN	1	
3		1	2	1	TRAIN	2	
4		1	2	1	TRAIN	2	
5		1	2	1	TEST	1	
6		1	2	1	TEST	1	
7		1	2	2	TRAIN	2	\
8		1	2	2	TRAIN	2	\ \
9		1	2	2	TRAIN	1	l \
10		1	2	2	TRAIN	1	\ \
11		1	2	2	TRAIN	2	l \
12		1	2	2	TRAIN	2	l \
13		1	2	2	TEST	1	I \
14		1	2	2	TEST	1	\

Then, all data rows with SAME TAG SET are grouped in the same processing BLOCK

```
12/04/12 12:11:11 INFO bigs: RULIX Stage 1
12/04/12 12:11:11 INFO bigs: RULIX configured task: KMeans [numberOfCentroids=20]
000 TopLevelTaskContainer [].preSubContainers
001 IterativeTaskContainer [numberOfIterations=3, iterationNumber=null].preMyContainers
002 IterativeTaskContainer [numberOfIterations=3, iterationNumber=1].preSubCortainers
003 DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=null].preMyContainers
004 DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=1] LOOP processDataItem
005 DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=2] LOOP processDataItem
```

. . . . .



## **DATA FLOW**

#### STATE IS PASSED ON FORWARD BY THE FRAMEWORK TO CHILD TASKS

```
12/04/12 12:11:11 INFO bigs: RULIX Stage 1
12/04/12 12:11:11 INFO bigs: RULIX configured task: KMeans [numberOfCentroids=20]
      TopLevelTaskContainer [].preSubContainers
000
001
        IterativeTaskContainer [numberOfIterations=3, iterationNumber=null].preMyContainers
            IterativeTaskContainer [numberOfIterations=3, iterationNumber=1].preSubContainers
002
               DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=null].preMyContainers
003
004
                  DataPartitionTaskContainer [numberofPartitions=3, partitionNumber=1] LOOP processDataBlock
                  DataPartitionTaskContainer [numberofPartitions=3, partitionNumber=2] LOOP processDataBlock
004
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=3] LOOP processDataBlock
004
005
              DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=null].postMyContainers
            IterativeTaskContainer [numberOfIterations=3, iterationNumber=1].postSubContainers
006
            IterativeTaskContainer [numberOfIterations=3, iterationNumber=2].preSubContainers
007
800
              DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=null].preMyContainers
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=1] LOOP processDataBlock
009
009
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=2] LOOP processDataBlock
009
                  DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=3] LOOP processDataBlock
              DataPartitionTaskContainer [numberOfPartitions=3, partitionNumber=null].postMyContainers =
010
            IterativeTaskContainer [numberOfIterations=3, iterationNumber=2].postSubContainers ■←
011
012
            IterativeTaskContainer [numberOfIterations=3, iterationNumber=3].preSubContainers
```

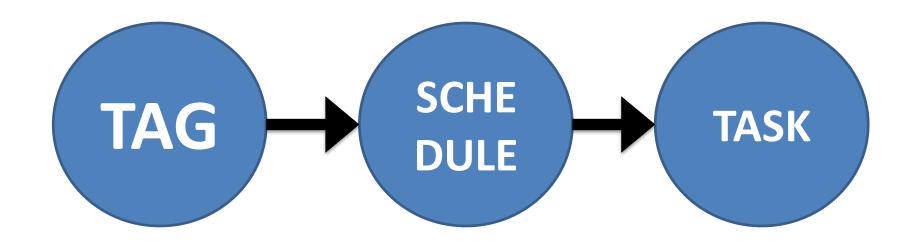
# TASK RESULTS and DATA ARE GATHERED AND PASSED ON BY THE FRAMEWORK ACCORDING TO SCHEDULE PRIORITIES AND PARENTSHIP. Must have two channels

- For processed data (such as for feature extraction)
- For process results (such as for Kmeans centroids)



## **TAG-SCHEDULE-TASK**

processing model



By **TaskContainers** managed by BIGS

By **BIGS**, according to **TaskContainers** parallelization support

By **Tasks** through **TaskContainers** managed by BIGS **WORKERS**