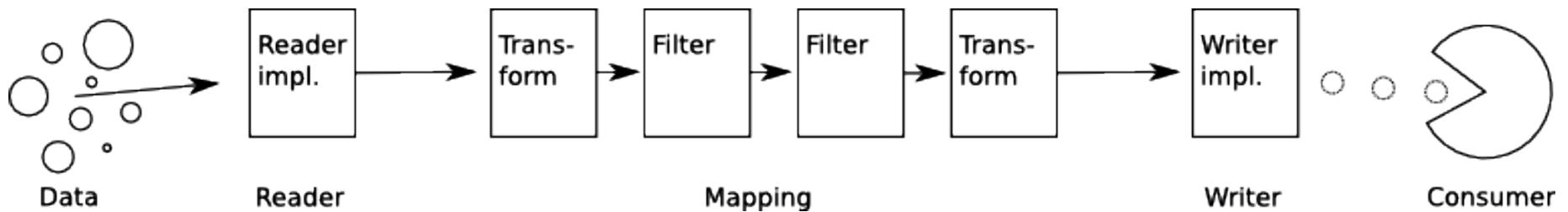


Feature Extraction Tutorial and/or Review

The Basics



```
class Reader<K,V> {  
    K getCurrentKey();  
    V getCurrentValue();  
    boolean nextKeyValue();  
    void close();  
}
```

```
class Output<K,V> {  
    void write(K key, V value)  
    void close();  
}
```

```
class Mapping<Ki,Vi,Ko,Vo> {  
    void map(Ki key, Vi val, Output<Ko, Vo> out);  
}
```

General workflow:

```
Reader<Ki, Vi> reader;
Mapping<Ki, Vi, Ko, Vo> mapping;
Output<Ko, Vo> out;

while (reader.nextKeyValue()) {
    Ki key = reader.getCurrentKey();
    Vi value = reader.getCurrentValue();
    mapping.map(key, value, out);
}

out.close();
```

.. but you don't do that,
the execution environment does
(and does it better too)

Basic (out of box) execution environment

```
BasicExecutionEnvironment env;  
  
Reader<Ki, Vi> reader;  
Mapping<Ki, Vi, Ko, Vo> mapping;  
Output<Ko, Vo> out;  
  
env.execute(reader, mapping, out);
```

... but remember everything an execution environment is supposed to do: Error handling, parallelism, define “workflows”, etc.

Error handling

- Mapping impls are defined to be stateless
 - Order of execution should not matter, execution environment is free to re-order as it sees fit
- Output impls are defined to be idempotent
 - The same value can be re-submitted an arbitrary number of times without consequence
- Reader impls are NOT stateless, and are designed to be iterated through only once per execution job

Error handling

- Coping strategy: for a given key+value pair, if a mapping or write to Output fails, try again

```
BasicExecutionEnvironment env;  
ExceptionListener el;  
  
Reader<Ki, Vi> reader;  
Mapping<Ki, Vi, Ko, Vo> mapping;  
Output<Ko, Vo> out;  
  
env.execute(reader, mapping, out, el);
```

Error handling

One way to do it (anonymous inner class):

This example always re-submits

```
env.execute(reader, mapping, out, new ExceptionListener() {  
    public void exceptionThrown(ExecutionTaskException e) {  
        e.getTask().run();  
    }  
});
```

Problem: What if the exception is always thrown, e.g. a bug in code
Vs a transient network effect?

Solution: could keep a count of failures per key/value pair and stop at
A fixed number.

Question: Would it be useful to have a utility to do so, or have a wrapper
for BasicExecutionEnvironment that does that automatically?

Error handling

- Behind the scenes, `BasicExecutionEnvironment` is keeping track of each key+value operation.
 - Adds job to “the list” if it fails and is not addressed yet
 - If calling code does `retry()`, these get priority, and emptied from the queue when (if) they succeed
 - If calling code does `getTask().run()`, the `Runnable` will do this accounting.. and of course notify the listener if the task fails yet again.
- So `BasicExecutionEnvironment` guarantees every key+value pair is run at least once. Unless...

Error Handling

```
BasicExecutionEnvironment env;  
env.setDropFailedTasks(true);  
ExceptionListener el;  
  
Reader<Ki, Vi> reader;  
Mapping<Ki, Vi, Ko, Vo> mapping;  
Output<Ko, Vo> out;  
  
env.execute(reader, mapping, out, el);
```

- If set to drop failed tasks, will allow exceptionListener to simply ignore exception (and allow a key+value pair to be dropped)
- If no exceptionListener given, execute() will throw an exception if one is encountered, so an exceptionListener is really needed in order to selectively drop failed tasks.

Parallelism

```
ExecutorService exe;
```

```
BasicExecutionEnvironment env =  
    new BasicExecutionEnvironment(exe);
```

- Every key+value pair mapping operation is wrapped in a Runnable (sound familiar?) and submitted to a java ExecutorService.
- ExecutorService responsible for the performance characteristics of an extraction/transformation job

Parallelism

- `Executors.newCachedThreadPool()`
 - Java-provided, re-uses an existing thread if available, or starts a new one. Can result in lots of threads, though!
- `Executors.newFixedThreadPool(N)`
 - Java provided, limits the number of threads. BUT, submitted tasks are put into an infinitely large queue to wait until a thread becomes available.!

Parallelism

- Common Services to the rescue!
- `SynchronousExecutor()`
 - Used by default in `BasicExecutionEnvironment`
 - Simply executes every task immediately in current thread – no parallelism at all.
- `BoundedBlockingPoolExecutor(N)`
 - Uses a fixed thread pool, but no queue
 - Job submission blocks until a thread is available

Ingest use case

- Potentially many feature extraction tasks to perform, each one could potentially:
 - Export data to another service (index)
 - Modify the SIP based upon extracted feature
 - Generate event(s) based upon a particular extraction
 - Allow a non-essential feature extraction job to fail and not kill the ingest
 - Force ingest to terminate if an essential feature extraction job fails

Ingest use case

```
class BasicFeatureExtraction extends IngestServiceBase {  
  
    @Required  
    void setJobs(List<Job<?, ?>> jobs);  
  
    void execute(String sipRef); // from IngestService  
}  
  
class Job<Ko, Vo> {  
  
    @Required  
    void setMapping(Mapping<String, Dcp, Ko, Vo> map);  
  
    @Required /* but will have to change in Y3 */  
    void setOutputFactory(OutputFactory<Ko, Vo> outfac);  
  
    void setOutcomeListener(OutputListener l);  
  
    Void setExceptionListener(ExceptionListener l);  
  
    void setLabel(String label)  
  
    void setFailureAllowed(boolean allowFail); // for the lazy  
    void setCreateEvent(boolean createEvent); // for the lazy  
}
```

Ingest use case

```
/* part of ingest service */
interface OutcomeListener {

    void onSuccess(String sipRef, IngestFramework fwk);

    void onFailure(String sipRef, IngestFramework fwk,
                   Exception e);
}

/* from feature extraction “execution” interfaces
interface OutputFactory<K,V> {

    Output<K,V> newOutput();

    /* Sneak preview of Y3 needs */
    public void close(boolean... success);
}
```

Ingest use case

```
<bean id="featureExtraction"
  class="org.dataconservancy.dcs.ingest.services.BasicFeatureExtraction">

  <property name="ingestFramework"
    ref="org.dataconservancy.dcs.ingest.IngestFramework" />

  <property name="executionEnvironment"
    ref="ingestFeatureExtractionExecutionEnvironment" />

  <property name="jobs">
    <list>
      <ref bean="dcpSolrJob" />
      <ref bean="generalModelJob" />
      <ref bean="registryUpdateJob" />
    </list>
  </property>
</bean>
```

Question related to DCS instance configuration. Is one list of jobs sufficient, or can/should/must jobs be added in a modular fashion. For example, a method invoking bean + addJob(Job<?,?>) method on BasicFeatureExtraction.

Ingest use case

Example general model indexing job, run every ingest.

```
<bean id="generalModelJob"
  class="org.dataconservancy.dcs.ingest.services.BasicFeatureExtraction$Job">

  <property name="mapping" ref="generalModelMappingChain" />
  <property name="outputFactory" ref="generalModelIndexOutputFactory" />
  <property name="outcomeListener" ref="gqmIndexJobListener" />
</bean>

<bean name="generalModelIndexOutputFactory"
  class="org.dataconservancy.dcs.index.transform.IndexOutputFactory">
  <property name="indexService" ref="generalModelIndexService"/>
</bean>

<bean name="gqmIndexJobListener"
  class="org.dataconservancy.dcs.index.transform.IndexEventLogger">
  <property name="indexName" value="GQM" />
</bean>
```

Chaining

```
<bean id="generalModelMappingChain"
      class="org.dataconservancy.dcs.transform.execution.MappingChain">

    <property name="chain">
      <list>

        <bean class="org.dataconservancy.transform.dcp.LeafNodeDuFilter" />

        <bean class="org.dataconservancy.transform.profile.DcpProfileEmitter">
          <property name="detectorMap" ref="profileDetectorMap" />
        </bean>

        <bean
      class="org.dataconservancy.transform.profile.RegistryBasedDcpProfileMapper">
          <property name="registry" ref="gqmTransformRegistry" />
        </bean>

        <list>
      </property>
    </bean>

    <bean id="gqmTransformRegistry"
          class="org.dataconservancy.transform.registry.SimpleRegistryImpl">
      <property name="map">
        </property>
    </bean>
```

Registry

```
<bean id="profileDetectorMap" class="java.util.HashMap">
  <constructor-arg>
    <map>
      <entry key="dataconservancy:profiles:DryValleysSip"
            value-ref="DryValleyDetector" />

      <entry key="dataconservancy:profiles:SDSSSip"
            value-ref="SDSSDetector" />
        <map>
    </constructor-arg>
<bean>

<bean id="gqmTransformRegistry"
      class="org.dataconservancy.transform.registry.SimpleRegistryImpl">
  <property name="map">
    <map>
      <entry key="dataconservancy:profiles:DryValleysSip"
            value-ref="DryValleyGQMTransform" />

      <entry key="dataconservancy:profiles:SDSSSip"
            value-ref="SDSSGQMTransform" />
        </map>
  </property>
</bean>
```