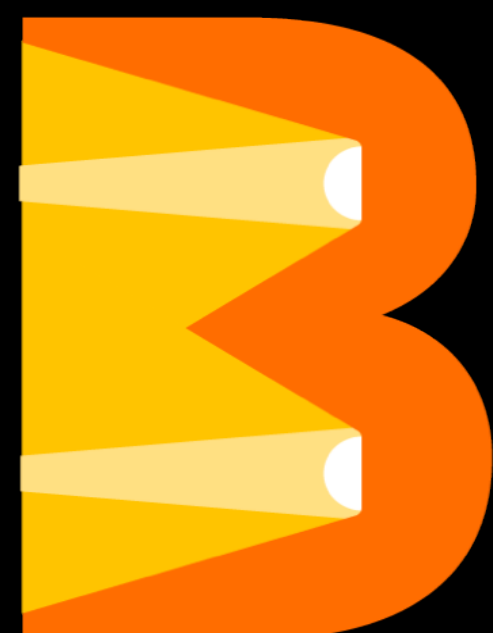




# The Best of Both Worlds

Unlocking the Power of Apache Beam with Apache Flink



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@stadtlegende

# Agenda

1. What is Apache Beam?
2. Why use Beam + Flink?
3. Classic Flink Runner
4. Portable Flink Runner
5. Getting Started





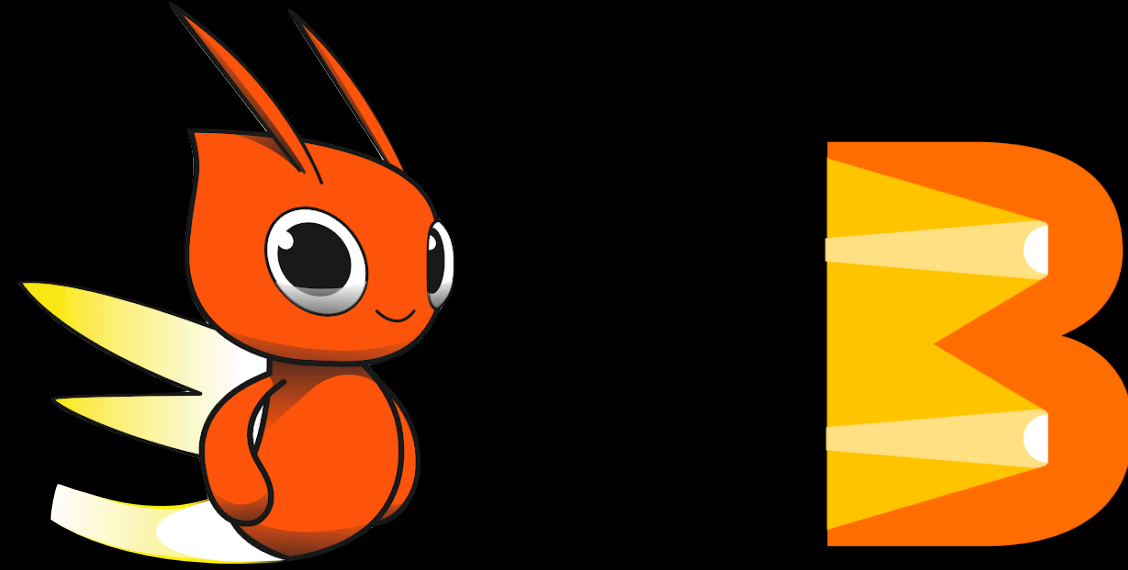
# About

- Software Engineer and Consultant
  - PMC / Committer at Beam / Flink
  - Ververica (dataArtisans) on Flink / Beam
  - Google and Lyft on Beam / Flink
- Focus: Beam Portability / Flink Runner



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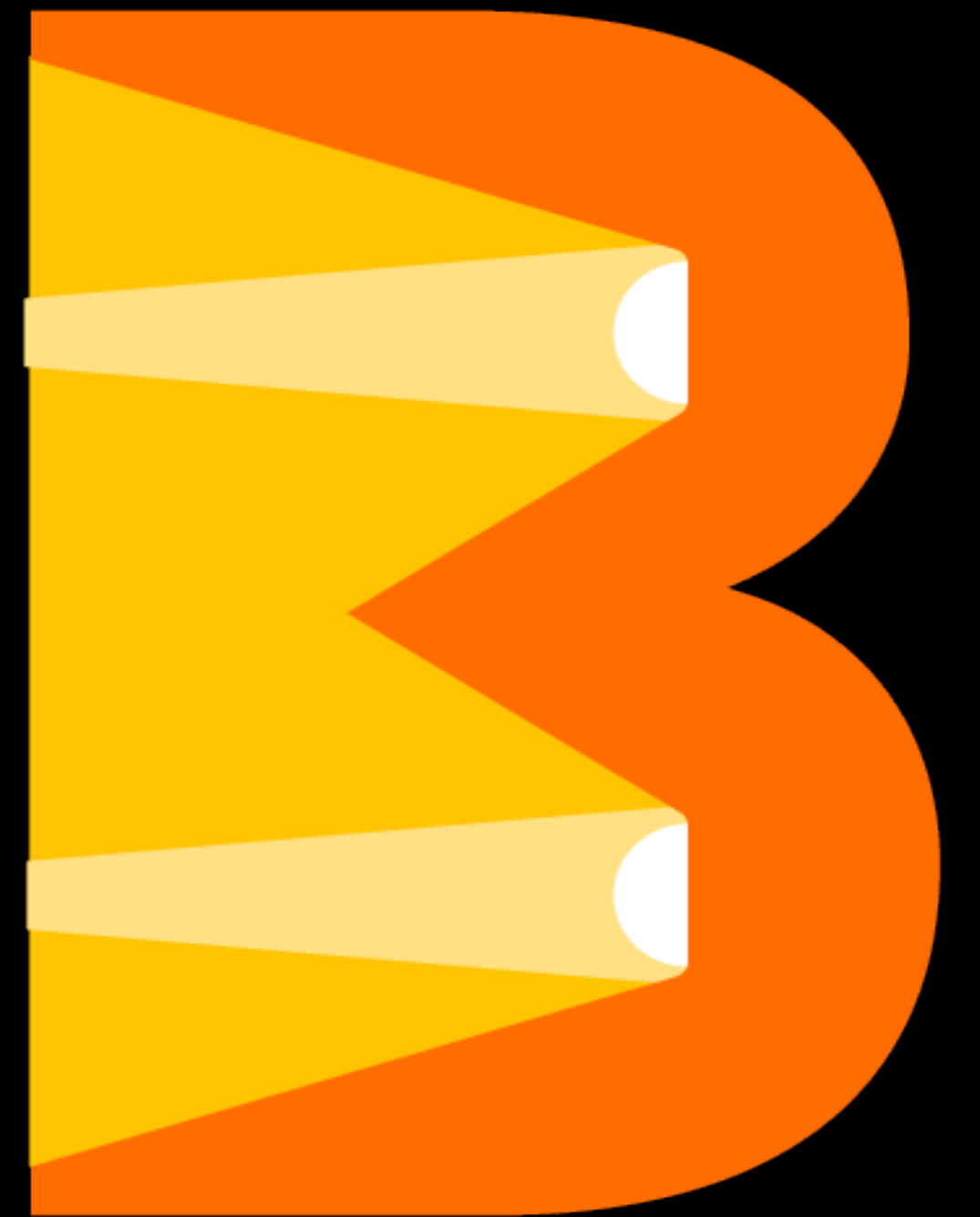


# What Is Apache Beam?



# What is Beam?

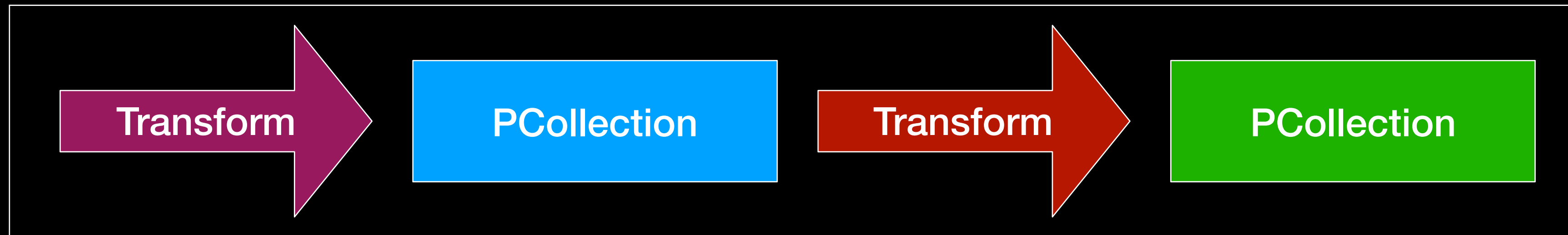
- Apache open-source project since 2016
  - Parallel/distributed data analytics
1. Unified API for batch and streaming
  2. Programming language of your choice
  3. Execution engine of your choice



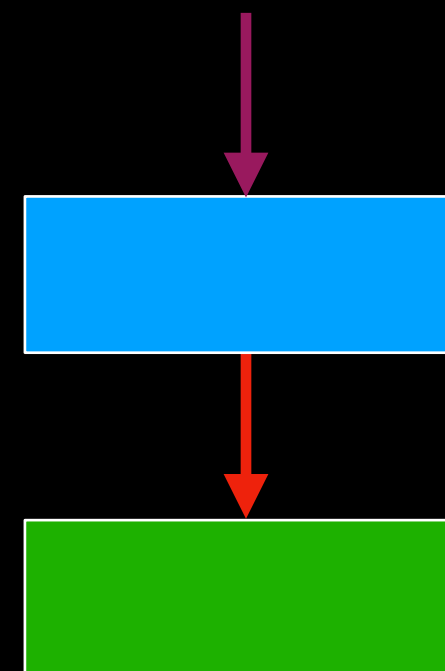
# 1. Unified API

- Apache Flink: DataStream, DataSet, Table
- Apache Spark: RDD, DStream, Dataset, Dataframe
- Apache Beam: Pipeline\*

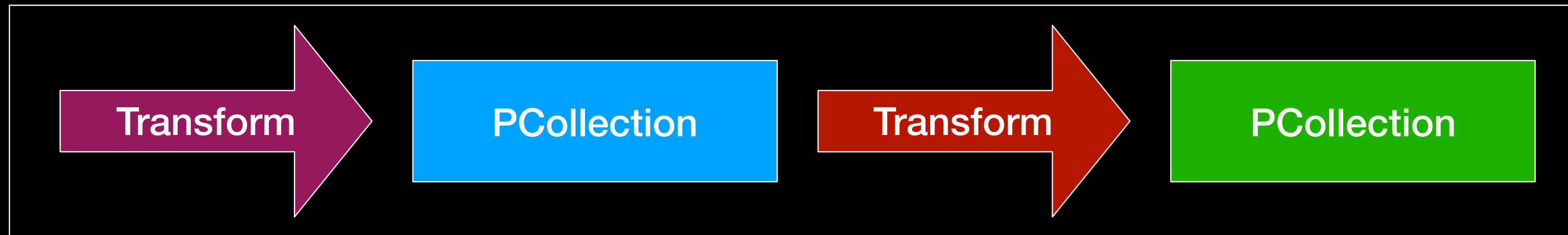
# Pipeline



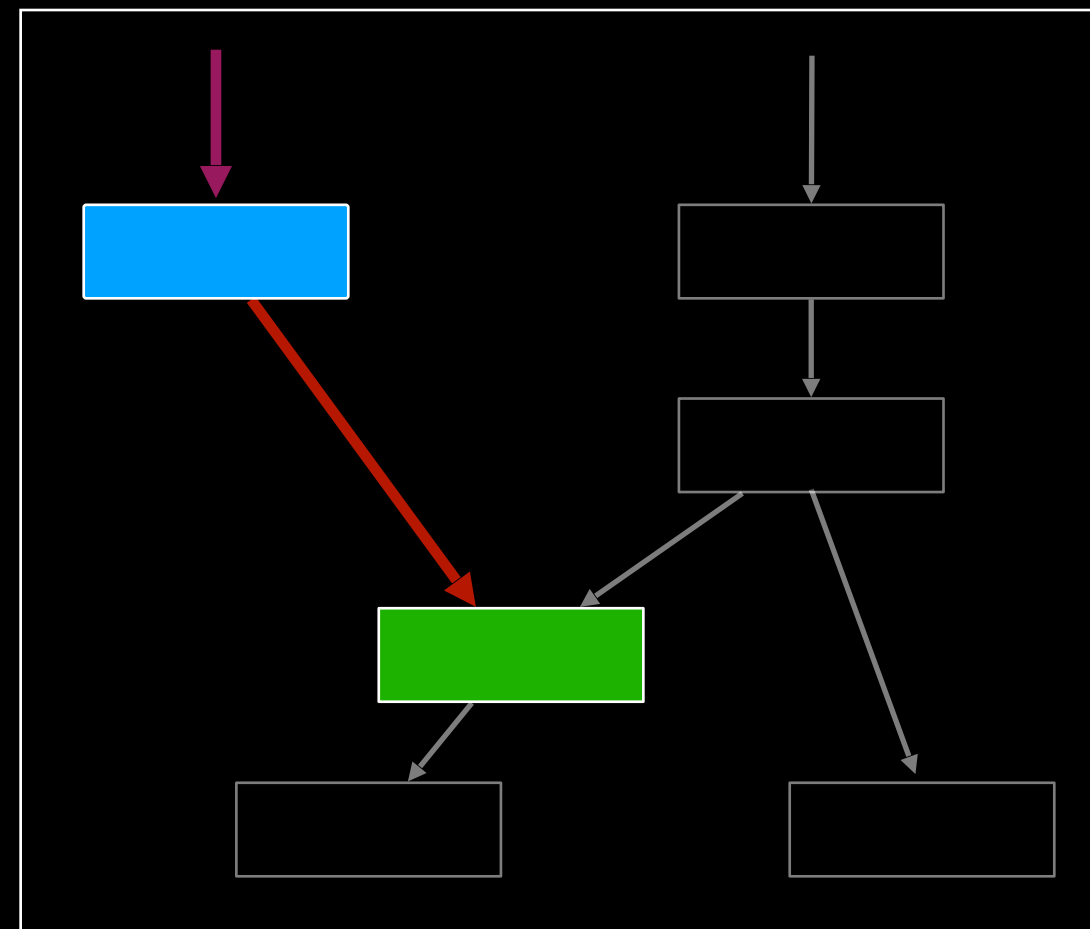
Pipeline



# Pipeline



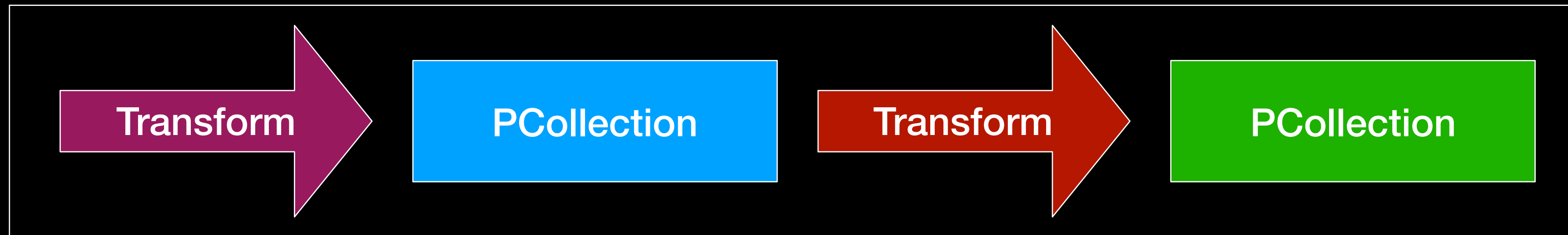
**Pipeline**



**Also a Pipeline**



# The Beam API



Pipeline

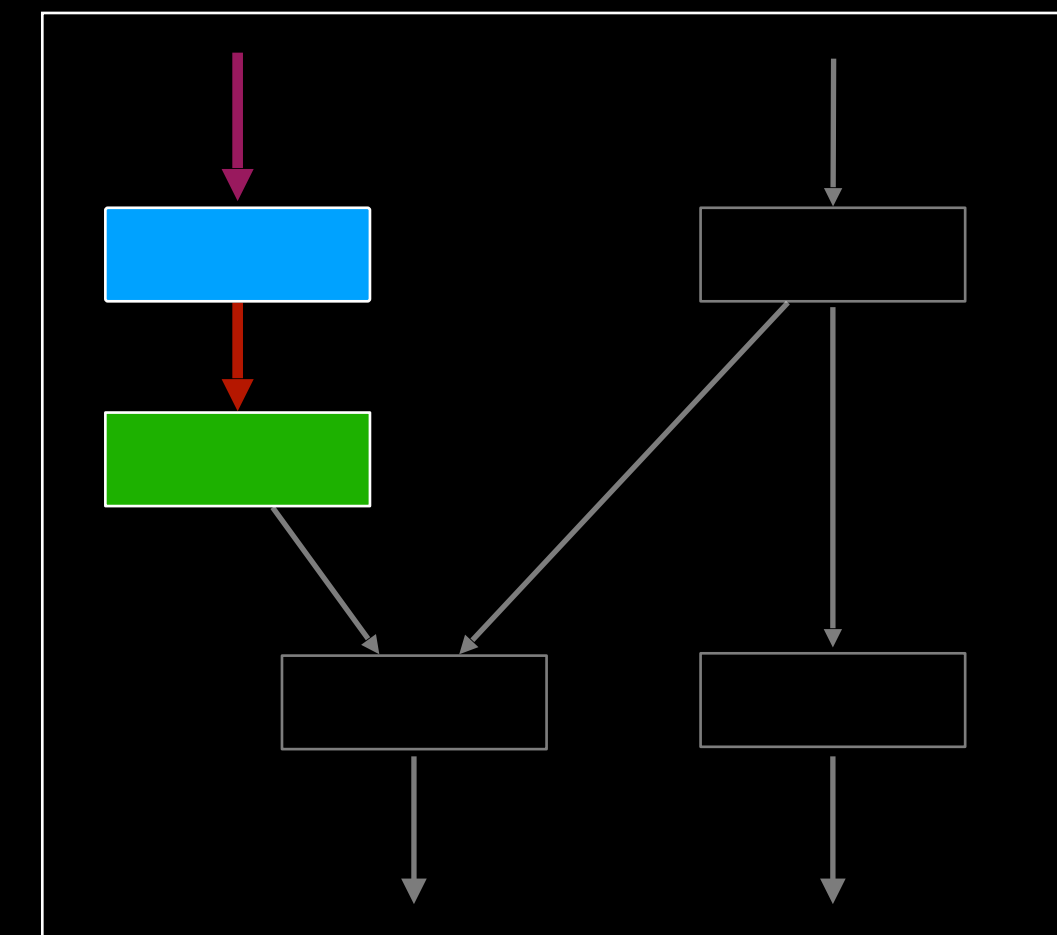
```
Pipeline p = Pipeline.create()
```

```
PCollection pCol1 = p.apply(transform)
```

```
PCollection pCol2 = pCol1.apply(transform)
```

```
PCollection pCol3 = p.apply(...).apply(...)
```

```
p.run()
```



# Transforms

- **Primitive** or **Composite**
- Composite transforms expand to primitive
  - For example:  
Combine = ParDo + GroupByKey + ParDo

## PRIMITIVE TRANSFORMS

---

Read

---

ParDo

---

GroupByKey

---

AssignWindows

---

Flatten

# WordCount

## ParDo

input -> output

str -> KV<str,int>

"to" -> KV<"to", 1>  
"be" -> KV<"be", 1>  
"or" -> KV<"or", 1>  
"not" -> KV<"not", 1>  
"to" -> KV<"to", 1>  
"be" -> KV<"be", 1>

## GroupByKey

KV<k,v> -> KV<k, [v1,v2,...]>

KV<str,int> -> KV<str,[int...]>

KV<"to", [1,1]>  
KV<"be", [1,1]>  
KV<"or", [1 ]>  
KV<"not", [1 ]>

## ParDo

input -> output

KV<str, [int...]> -> KV<str,int>

KV<"to", 2>  
KV<"be", 2>  
KV<"or", 1>  
KV<"not", 1>

"Map Phase"

"Shuffle Phase"

"Reduce Phase"

# Wordcount - Raw version

```
pipeline
  .apply(Create.of("to", "be", "or", "not", "to", "be"))
  .apply(ParDo.of(
    new DoFn<String, KV<String, Integer>>() {
      @ProcessElement
      public void processElement(ProcessContext ctx) {
        KV<String, Integer> outputElement = KV.of(ctx.element(), 1);
        ctx.output(outputElement);
      }
    })
  .apply(GroupByKey.create())
  .apply(ParDo.of(
    new DoFn<KV<String, Iterable<Integer>>, KV<String, Long>>() {
      @ProcessElement
      public void processElement(ProcessContext ctx) {
        long count = 0;
        for (Integer wordCount : ctx.element().getValue()) {
          count += wordCount;
        }
        KV<String, Long> outputElement = KV.of(ctx.element().getKey(), count);
        ctx.output(outputElement);
      }
    })
  ))
```



# Wordcount – Composite Transforms

pipeline

```
.apply(Create.of("to", "be", "or", "not", "to", "be"))  
.apply(MapElements.via(  
    new SimpleFunction<String, KV<String, Integer>>() {  
        @Override  
        public KV<String, Integer> apply(String input) {  
            return KV.of(input, 1);  
        }  
    })  
)))  
.apply(Sum.integersPerKey());
```

Composite  
Transforms





# Wordcount - More Composite Transforms

pipeline

```
.apply(Create.of("to", "be", "or", "not", "to", "be"))  
.apply(Count.perElement());
```

Composite  
Transforms



# Python to the Rescue

pipeline

```
| beam.Create(['to', 'be', 'or', 'not', 'to', 'be'])  
| beam.Map(lambda word: (word, 1))  
| beam.GroupByKey()  
| beam.Map(lambda kv: (kv[0], sum(kv[1])))
```



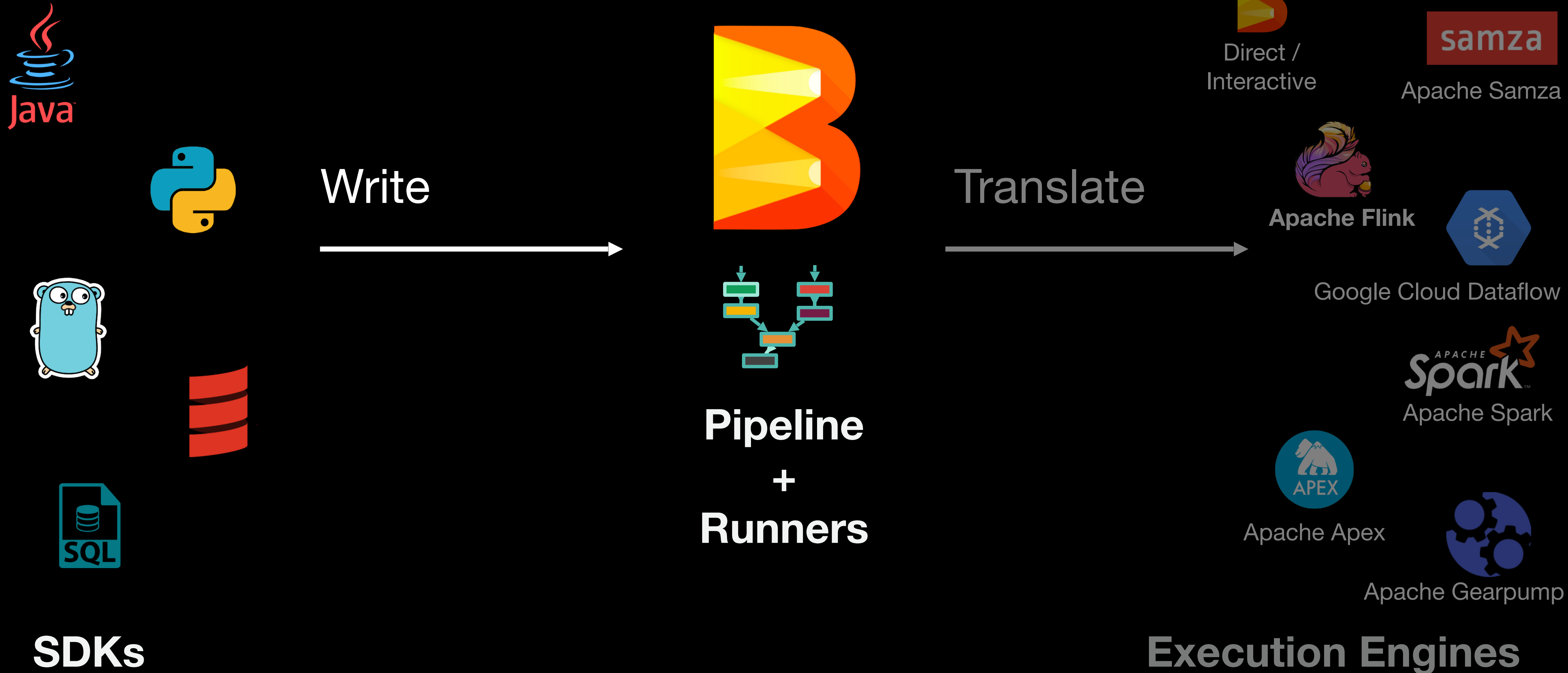
# Python to the Rescue

pipeline

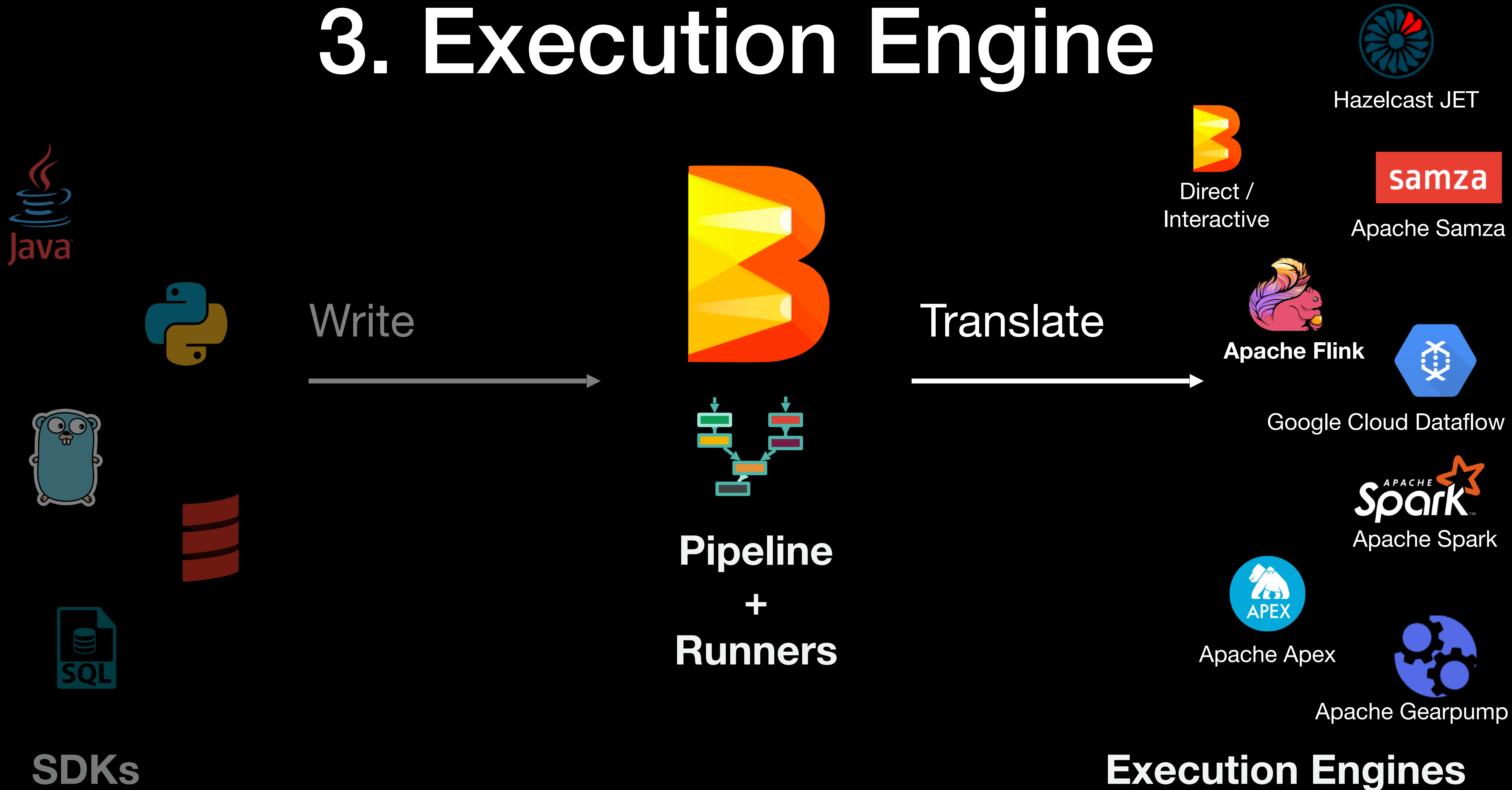
```
| beam.Create(['to', 'be', 'or', 'not', 'to', 'be'])  
| beam.Map(lambda word: (word, 1))  
| beam.CombinePerKey(sum)
```



# 2. Language

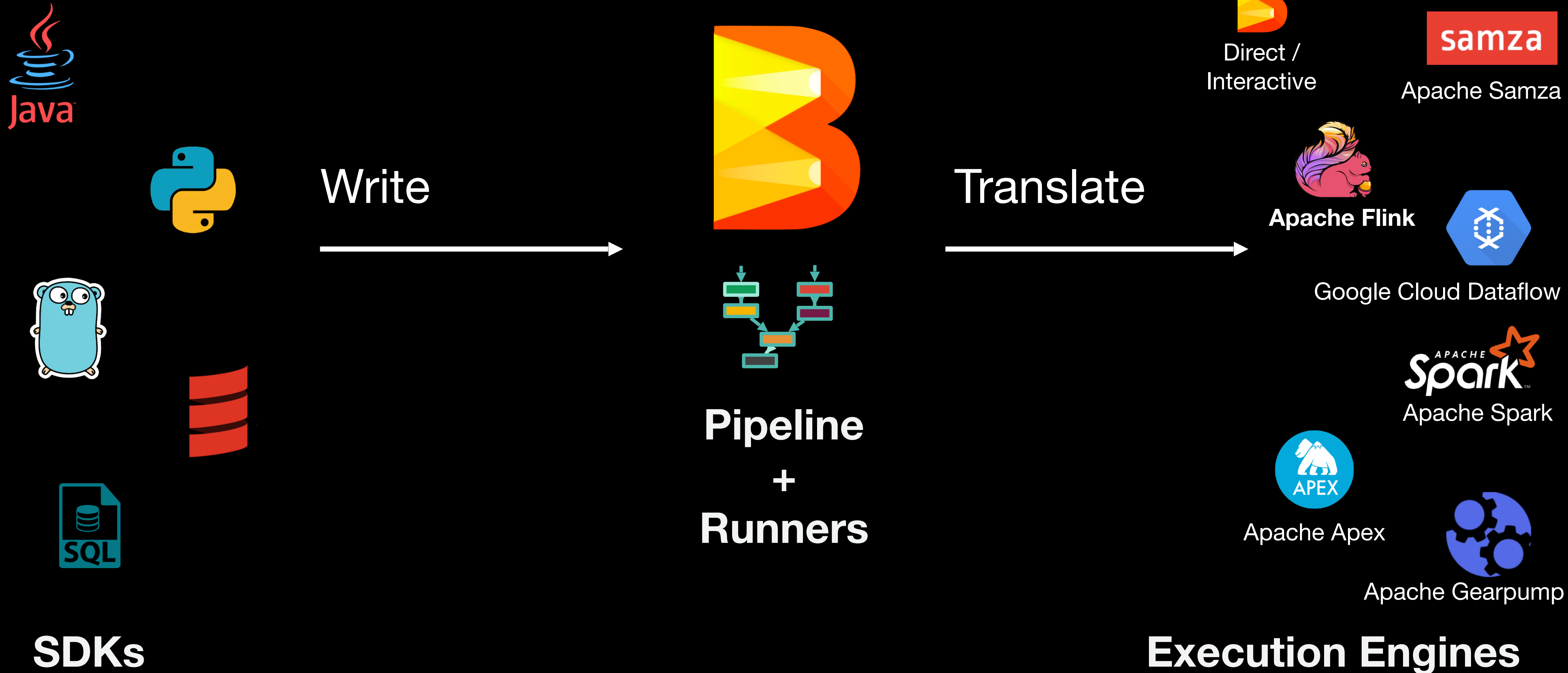


# 3. Execution Engine





# Apache Beam



# Why Use Beam + Flink?

# What is Flink?

- "Stateful Computations over Data Streams"
- A batch and stream processing engine
- Managed memory, exactly-once, checkpointing/savepoints
- Many of the same semantics as Beam





# Common: Beam vs Flink

- Distributed dataflow model
- Batch and stream processing
- Event time / processing Time
  - Watermarks
  - Timers / State
  - Windows / Triggers  
(we don't use the Flink primitives in Beam)



# Differences: Beam vs Flink

	 <b>Beam</b>	 <b>Flink</b>
<b>Type</b>	Execution abstraction	Execution engine
<b>API</b>	Unified Batch/Stream API	Separate Batch/Stream API, Unified Table API
<b>Languages</b>	Java/Scala, Python, Go, SQL	Java/Scala, (Python), SQL
<b>Control</b>	Auto-tuning	Very flexible (parallelism, partitioning/keying, resource usage)
<b>Beam</b>	Event Time (default) / Processing Time	Event Time / Processing Time (default)
<b>Window Assignment</b>	Eagerly	Lazily
<b>Key Grouping</b>	Explicit (via GroupByKey)	Implicit (window materialization or aggregations)
<b>Side Input</b>	Yes (including windowing)	Yes (low-level)
<b>Type System</b>	Type system with inference	Type system with inference and versioned serializers



# Why use Beam with Flink?

- Unified API  
(batch and streaming)
- Native Python support  
(+Java +Go +SQL +Scala)
- Power of Flink  
(exactly-once, robustness, memory management, etc.)
- Fully Flink-compatible  
(but runs also on Google Cloud Dataflow, Spark, etc.)
- More features  
(side inputs, cross-language pipelines)



# The Flink Runner

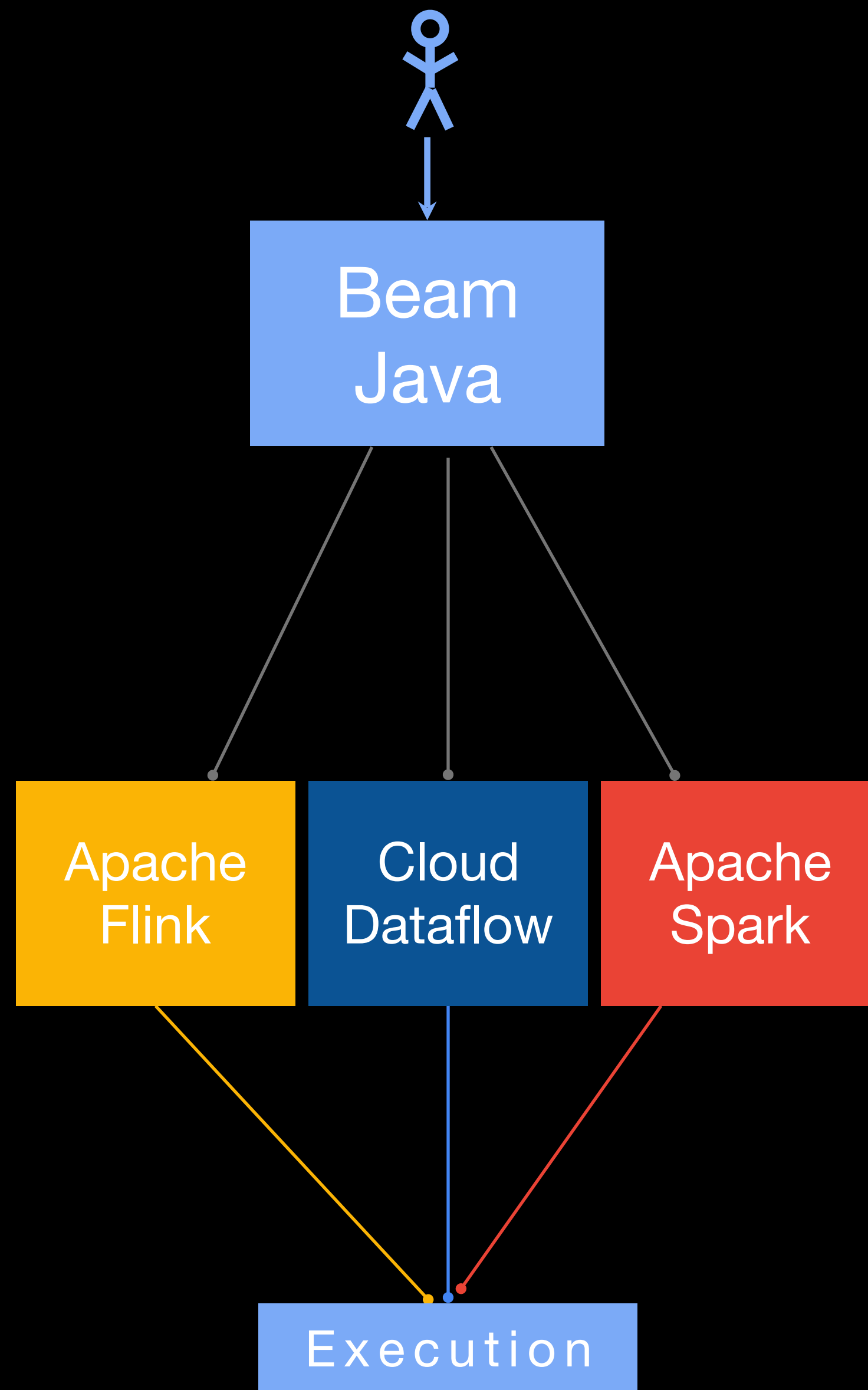


# Classic Runner

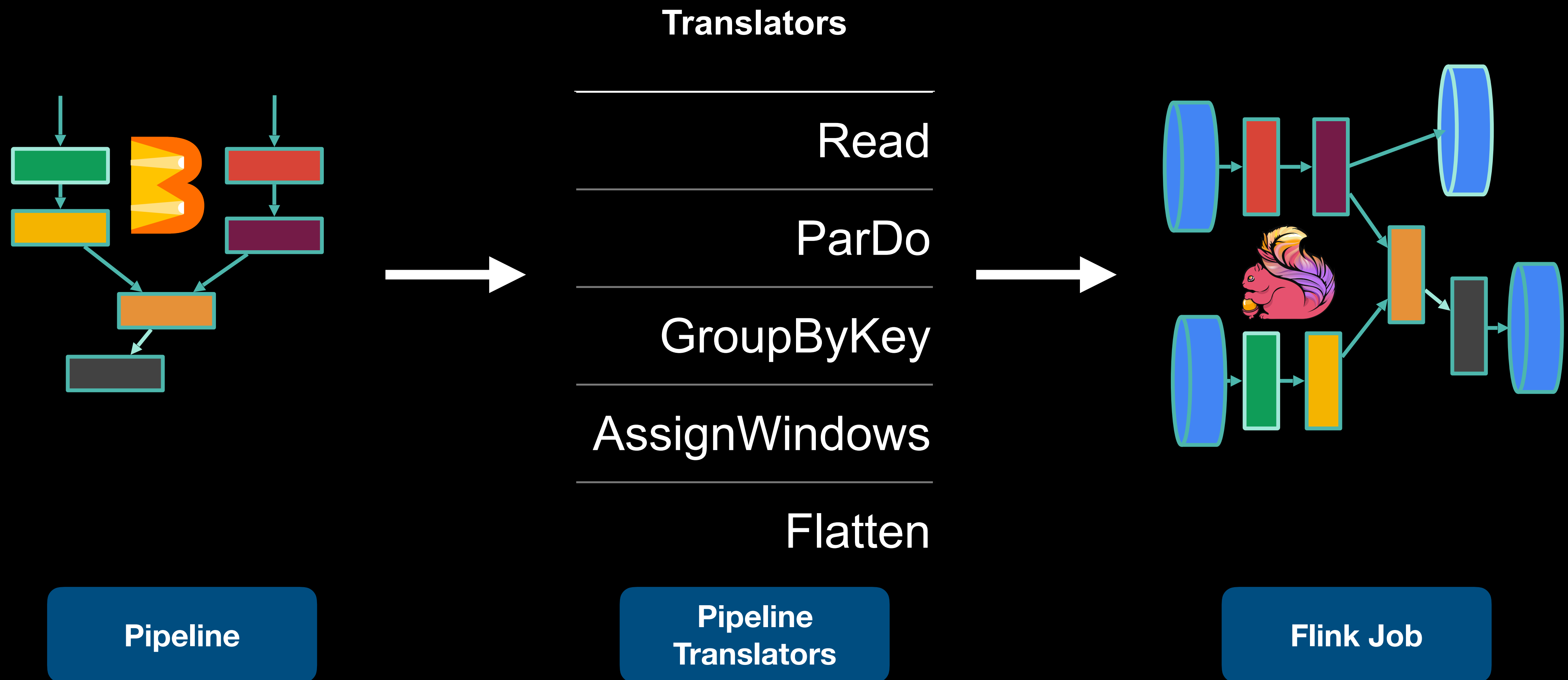
(Java/Scala, SQL)



# Classic Model

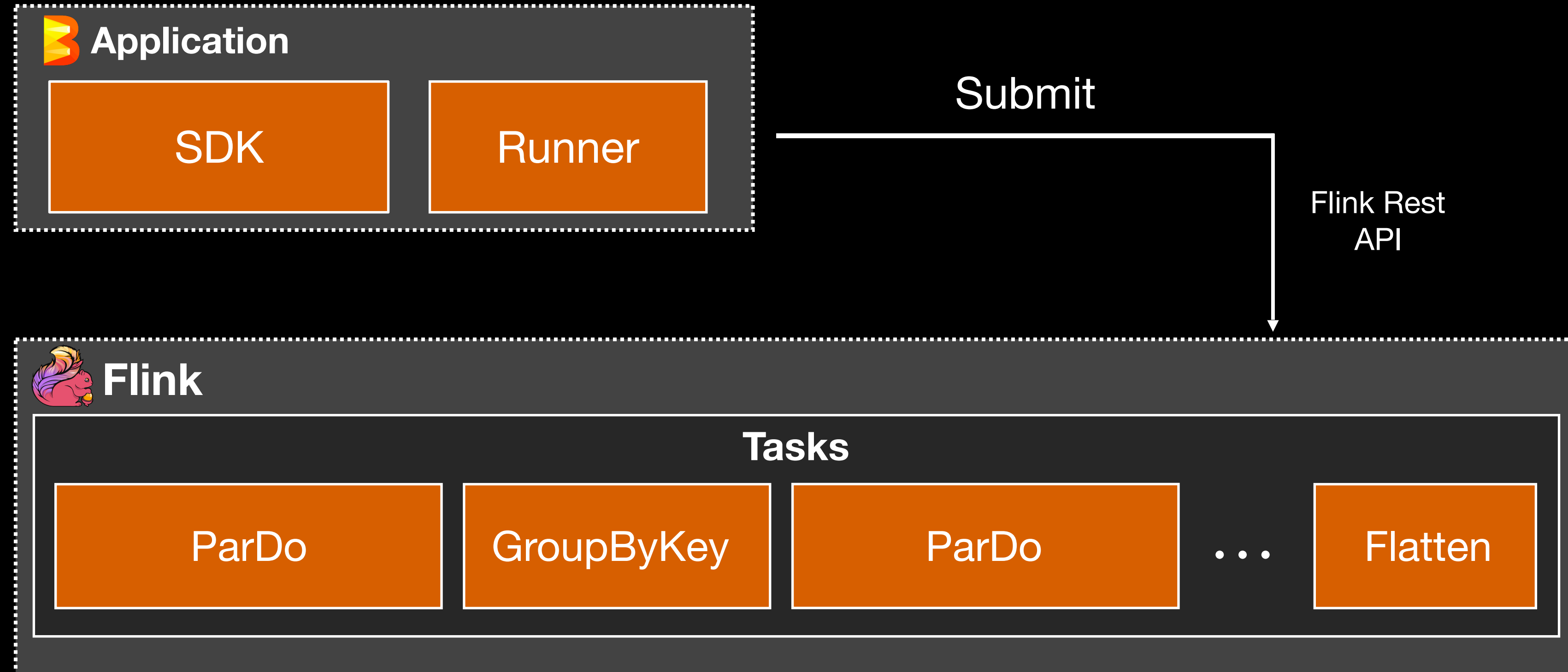


# Translating Beam to Flink



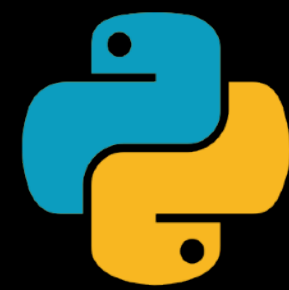


# "Classic" Architecture

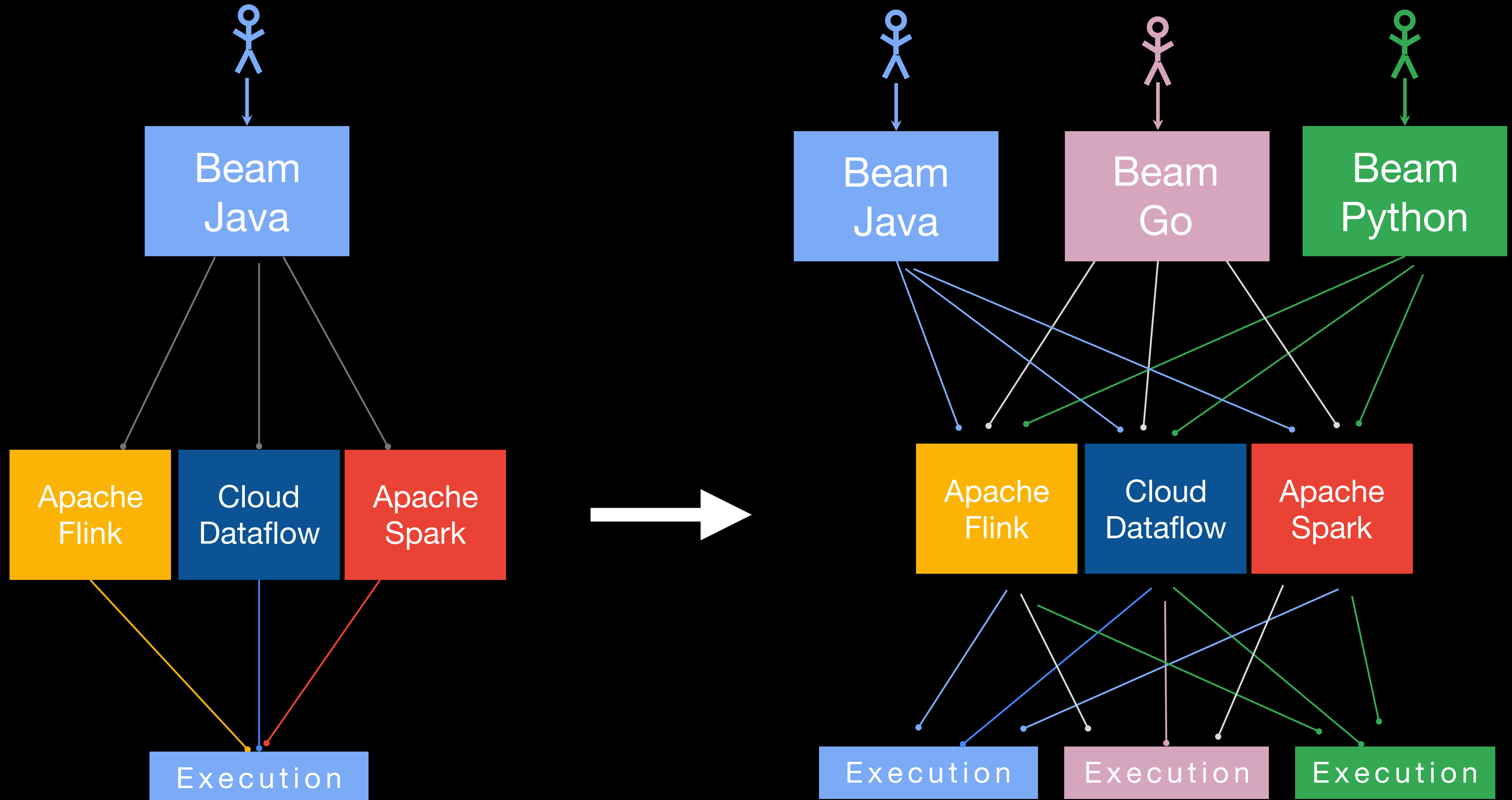


# Portable Runner

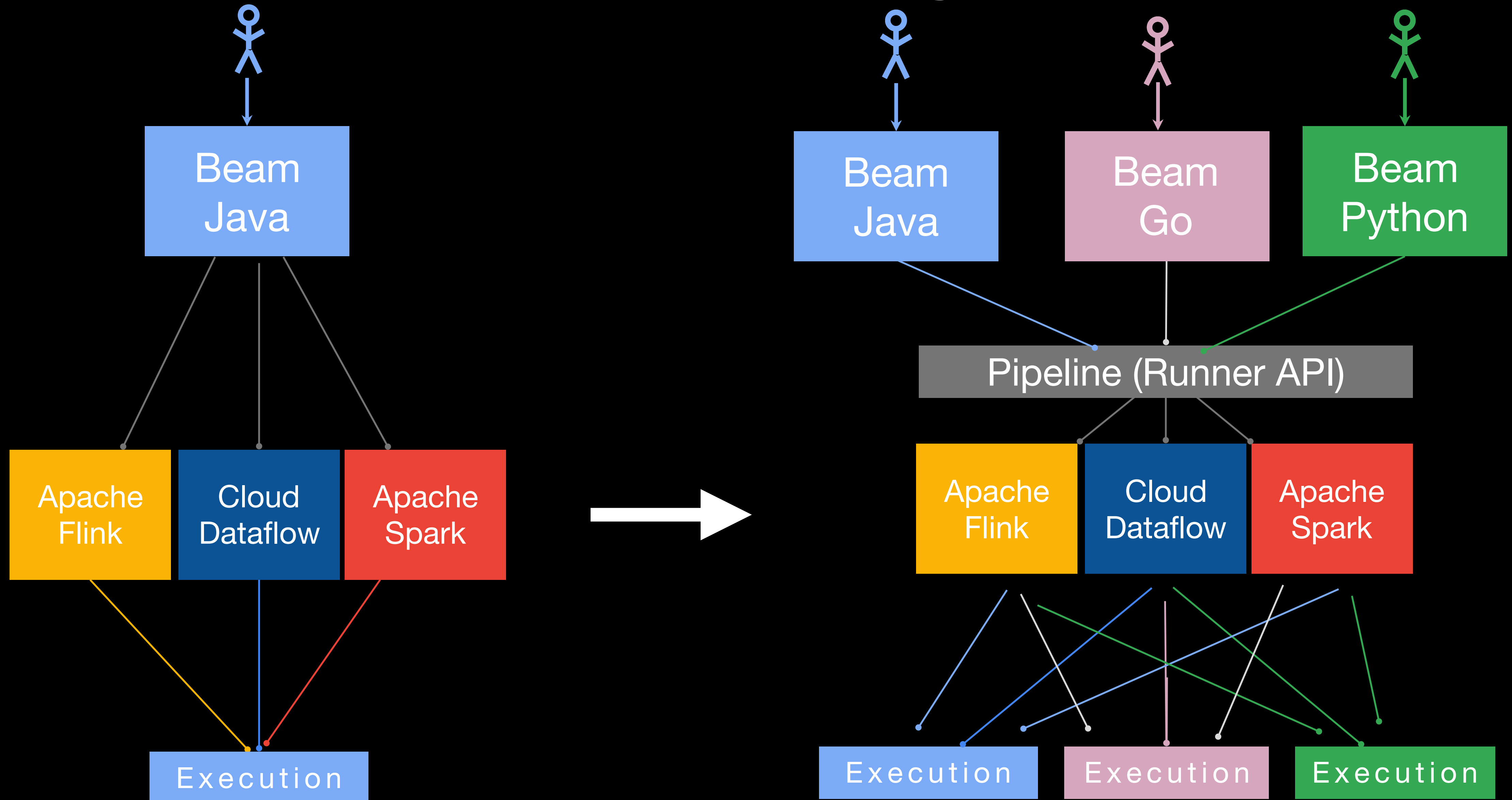
(Python, Go, SQL, Java/Scala)



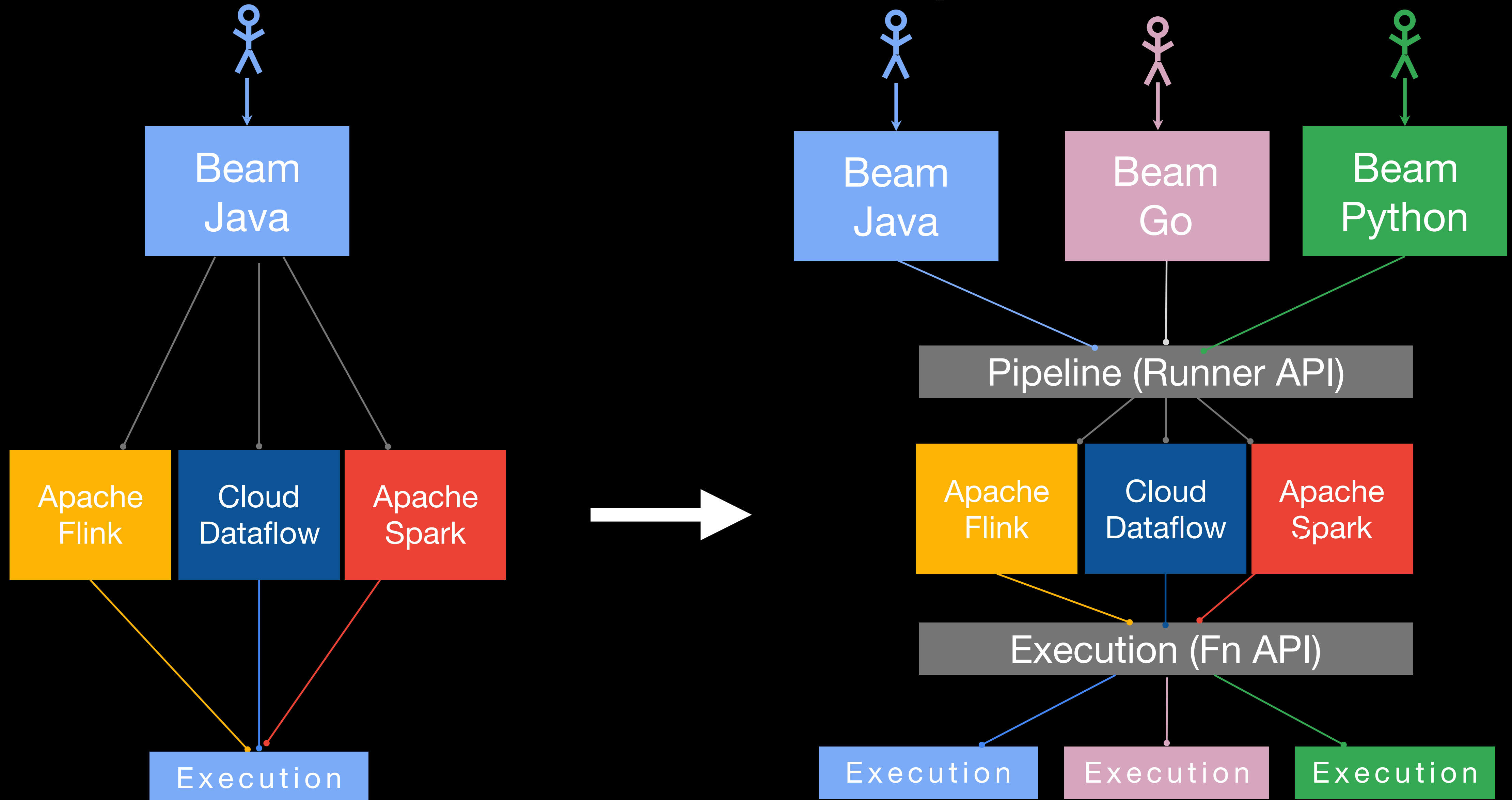
# Portability



# Portability



# Portability

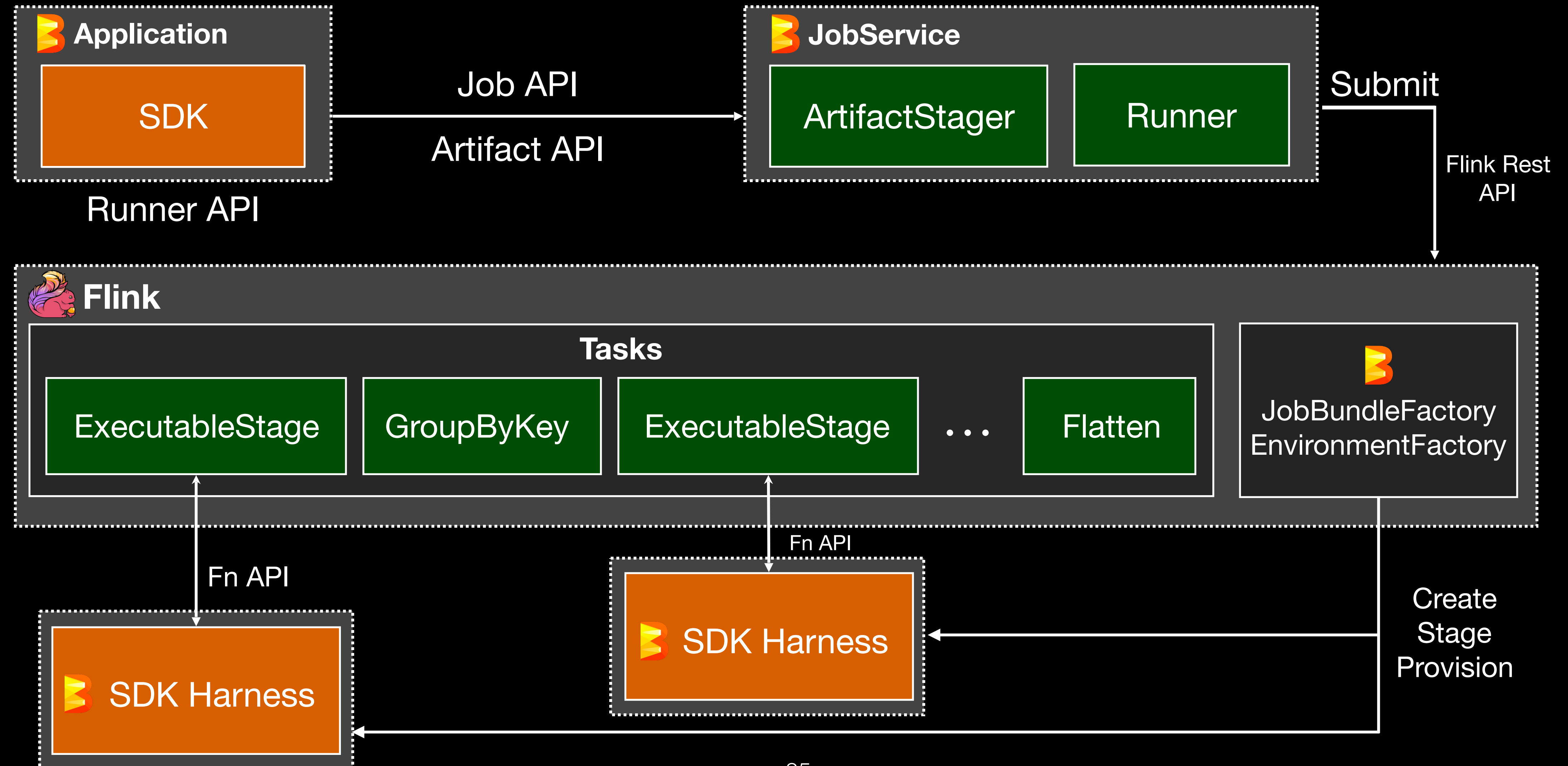
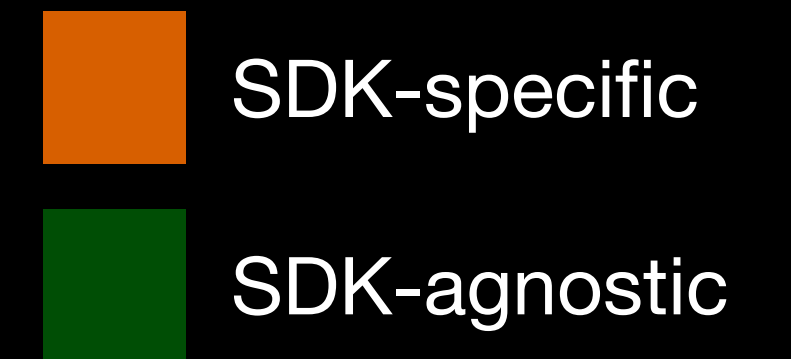


# Primitive Transforms

Classic	Portable
Read	Impulse + SDF
ParDo	ExecutableStage
GroupByKey	
Assign Windows	ExecutableStage
Flatten	

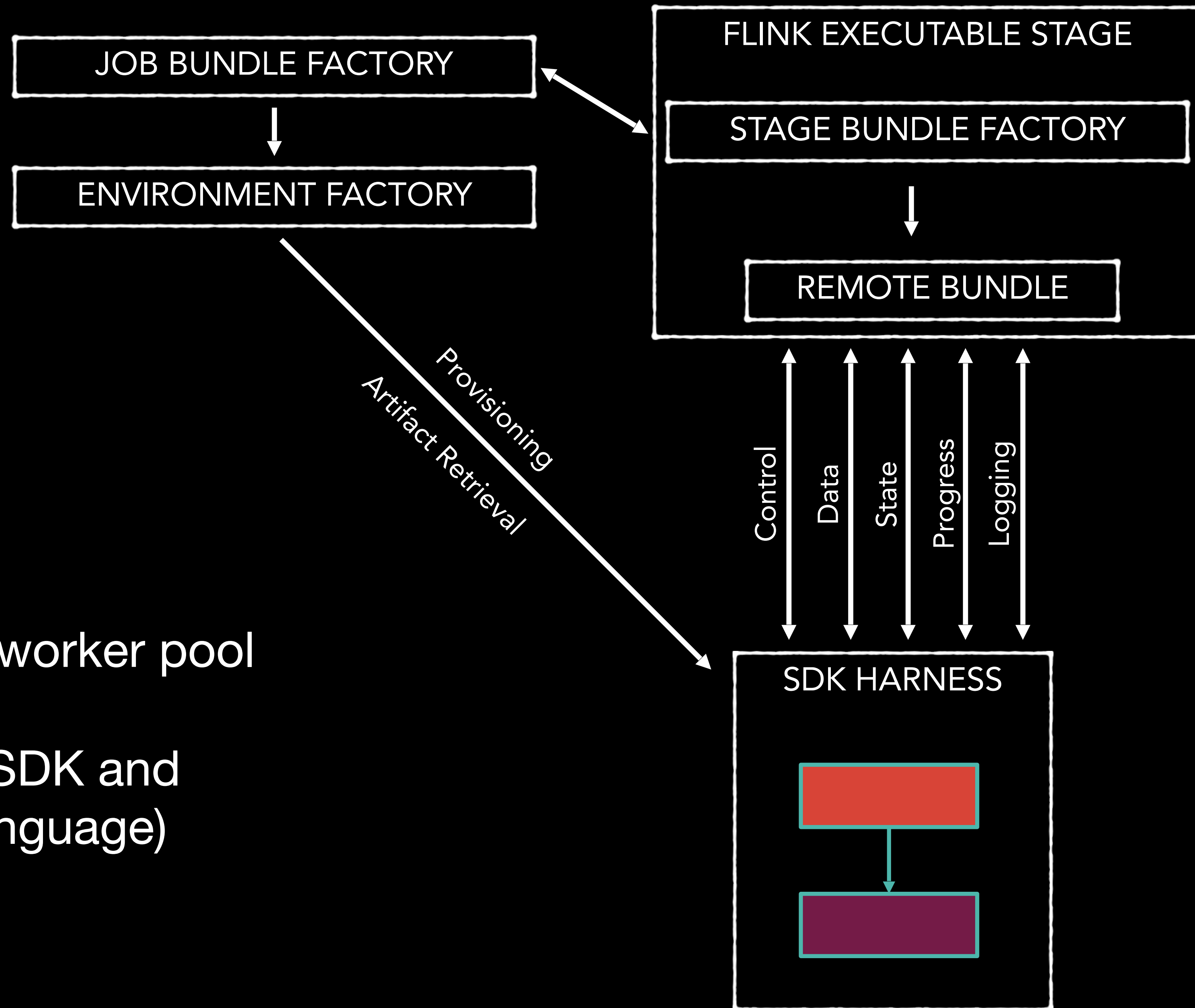


# Portability Architecture 1/3



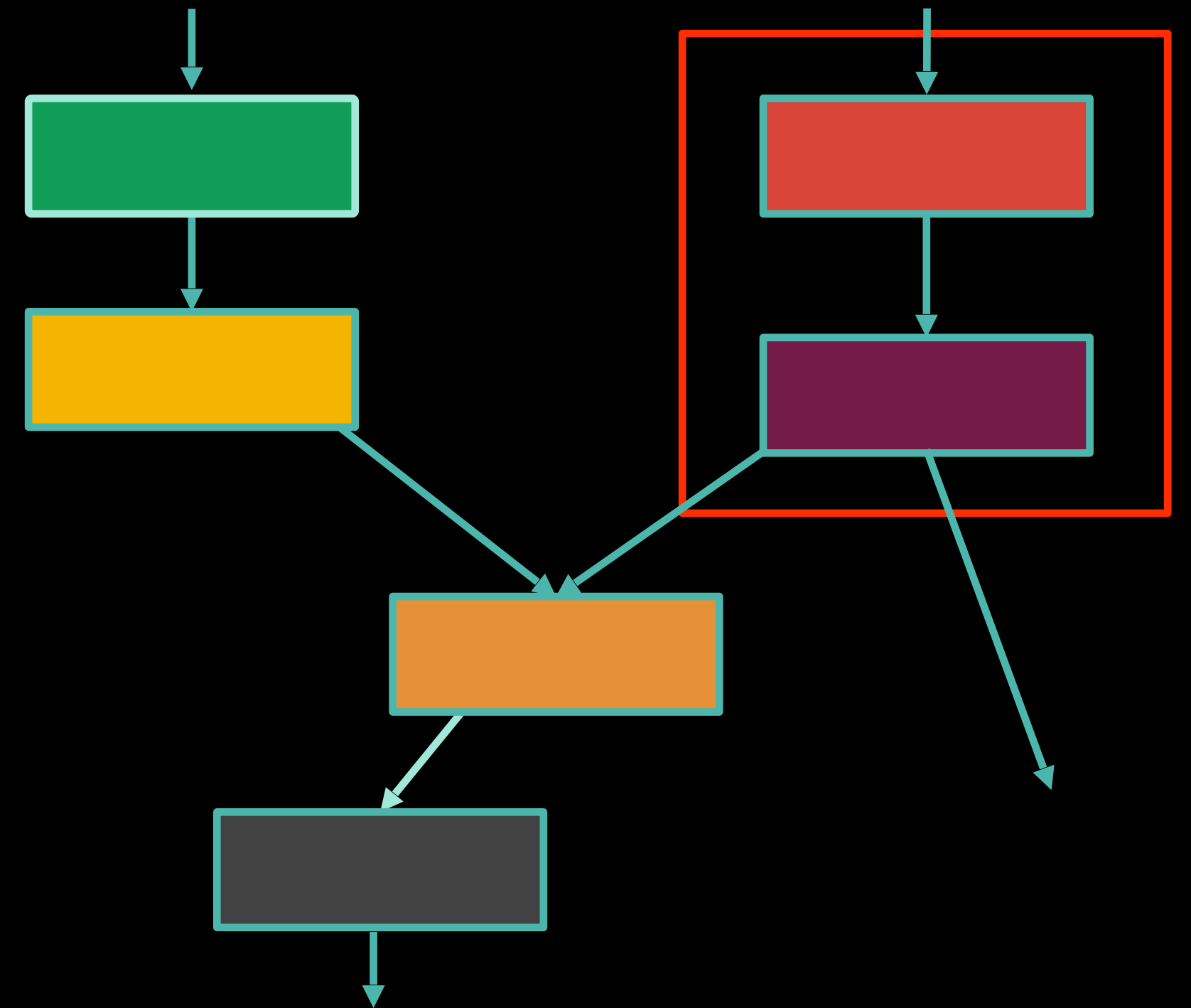
# SDK Harness

- SDK Harness runs
  - in a Docker container
  - in a dedicated process
  - in an externally managed worker pool
- embedded (only works if SDK and Runner share the same language)

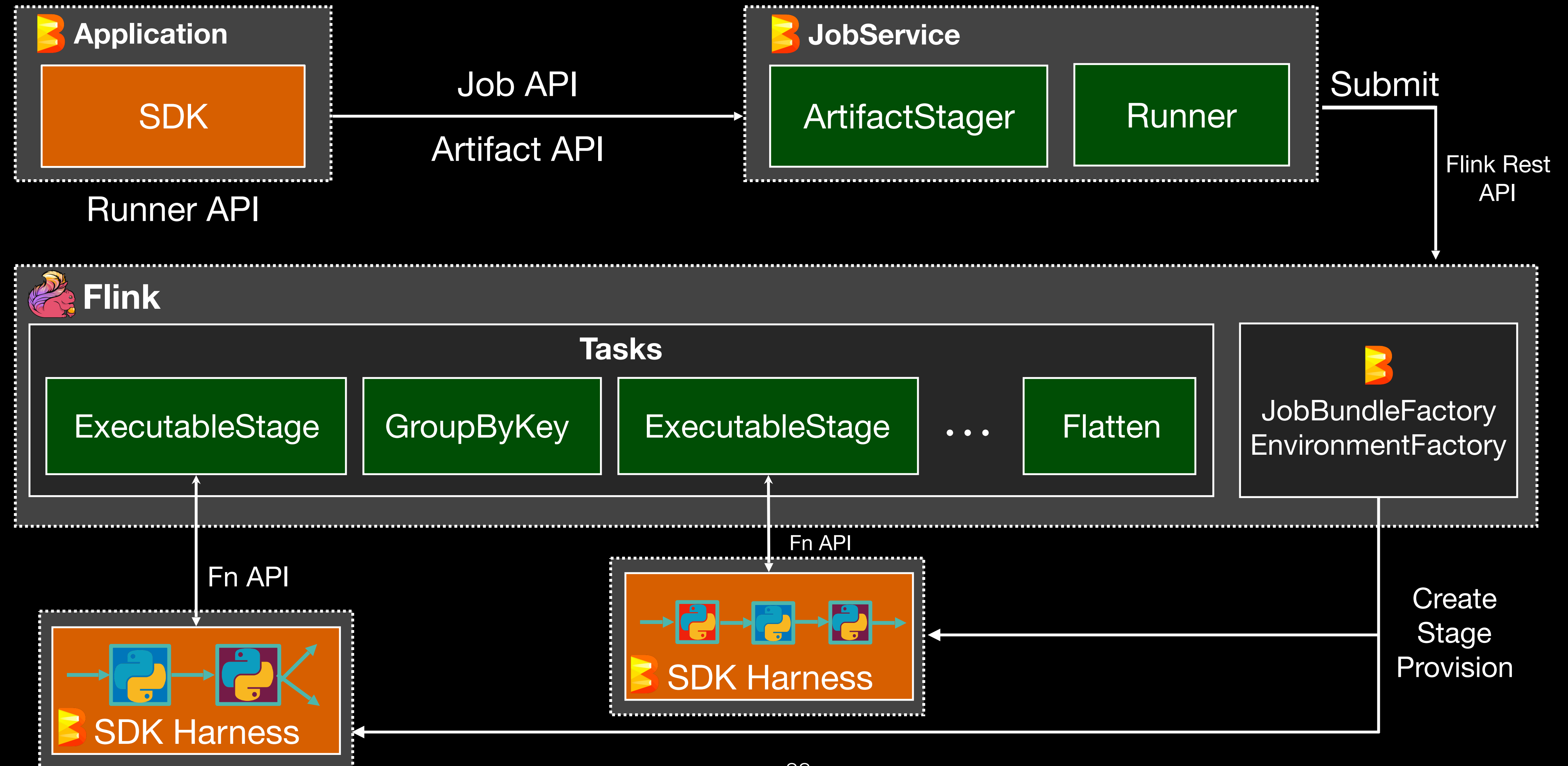
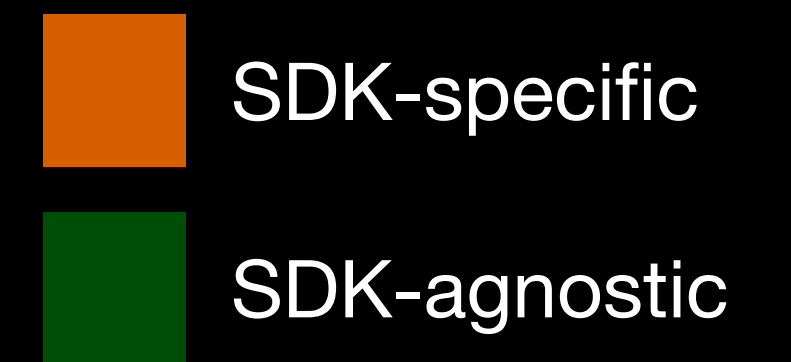


# Pipeline Fusion

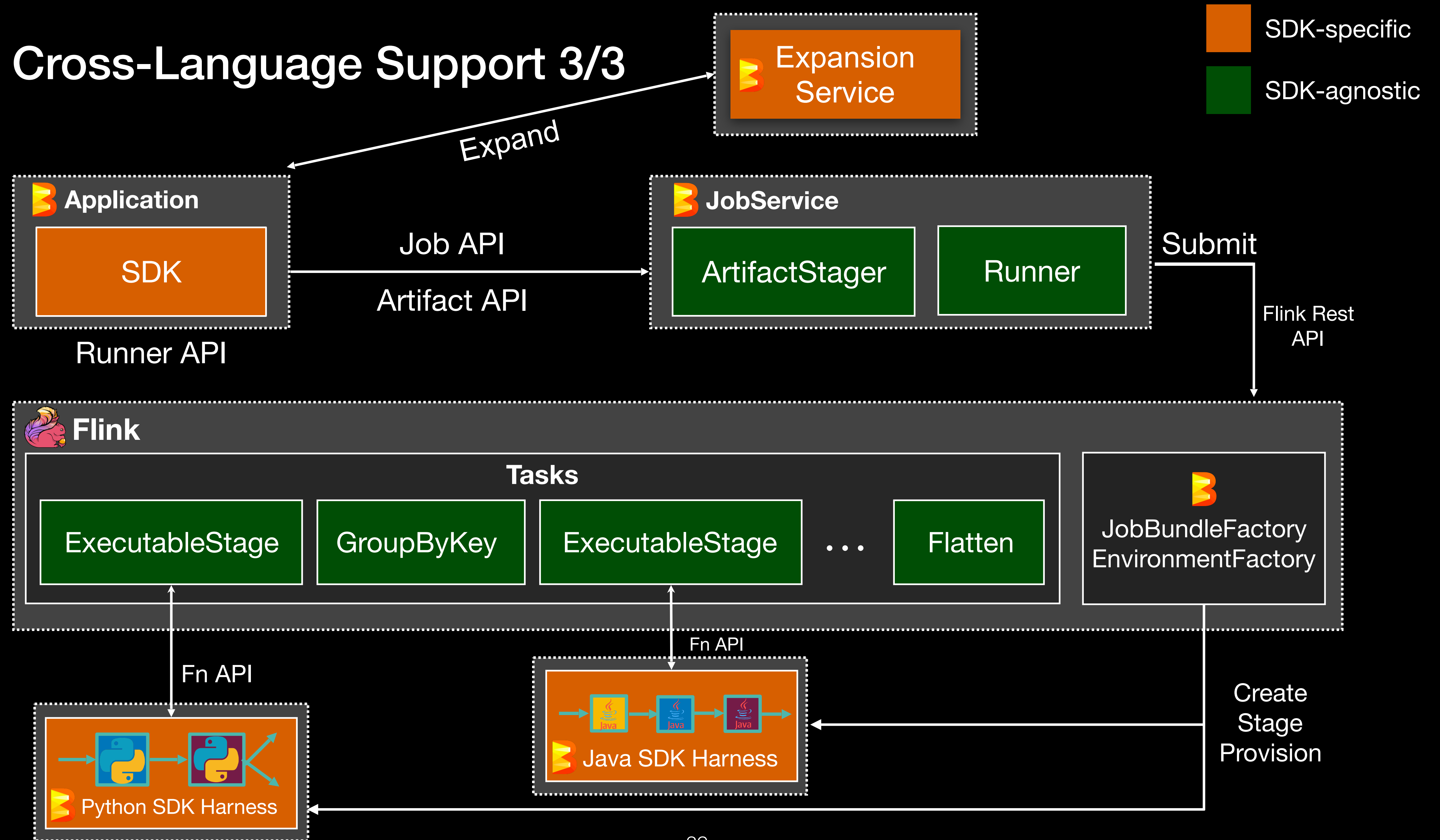
- SDK Harness environment comes at a cost
- Serialization step before and after processing with SDK harness
- User defined functions should be chained and share the same environment



# Portability Architecture 2/3



# Cross-Language Support 3/3



# Getting Started

# General Information

- Beam docs
  - [beam.apache.org/documentation/](https://beam.apache.org/documentation/)
- Getting Started
  - [beam.apache.org/get-started/](https://beam.apache.org/get-started/)
- Flink Runner
  - [beam.apache.org/documentation/runners/flink/](https://beam.apache.org/documentation/runners/flink/)



# Java

- Guide: [beam.apache.org/get-started/quickstart-java](https://beam.apache.org/get-started/quickstart-java)
  1. Use the Maven Quickstart
  2. Import project into IntelliJ
  3. Set the Runner: `--runner=FlinkRunner`
    - Optionally: `flinkMaster="flinkCluster:8081"`
  4. Run :)

# Java Blueprint

```
FlinkPipelineOptions options = PipelineOptionsFactory.fromArgs(args).as(FlinkPipelineOptions.class);

// Options can be set here or supplied via arguments
options.setStreaming(true); // Also via --streaming
options.setRunner(FlinkRunner.class); // Also via --runner=FlinkRunner

Pipeline p = Pipeline.create(options);

PCollection<String> hamlet = p
    .apply(Create.of("to", "be", "or", "not", "to", "be")));

PCollection<KV<String, Long>> wordCounts = hamlet
    .apply(Count.perElement());

wordCounts
    .apply(ToString.Kvs())
    .apply(TextIO.write().to("/output/path"));

p.run();
```

# Python

- <https://beam.apache.org/get-started/quickstart-py>
  1. `virtualenv --python=python3 env && source env/bin/activate`
  2. `pip install apache_beam`
  3. Write your pipeline
  4. Supply `--runner=FlinkRunner`
    - Optionally: `--flink_master=flinkCluster:8081`
  5. Run :)

# Python Blueprint

```
import apache_beam as beam

# By default this will load the command-line arguments
options = beam.PipelineOptions()

# This will automatically execute the pipeline
with beam.Pipeline(options=options) as p:
    (p
     | beam.Create(['to be or not to be']))
     | beam.Map(lambda el: el.split(' '))
     | beam.CombinePerKey(sum)
     | beam.Map(lambda kv: str(kv))
     | beam.io.filesio.WriteToFiles(path='output/path')
    )
```

# SQL

- <https://beam.apache.org/documentation/dsls/sql/overview/>
- Add artifact: org.apache.beam:beam-sdks-java-extensions-sql
  - Maven

```
<dependency>  
  <groupId>org.apache.beam</groupId>  
  <artifactId>beam-sdks-java-extensions-sql</artifactId>  
  <version>2.20.0</version>  
</dependency>
```
  - Gradle

```
compile group: 'org.apache.beam',  
  name: 'beam-sdks-java-extensions-sql',  
  version: '2.20.0'
```

# SQL Blueprint

```
Schema schema =  
    Schema  
        .builder()  
        .addInt32Field("id")  
        .addStringField("name")  
        .build();
```

```
PCollection<Row> input = pipeline  
    .apply(Create.of(Row.withSchema(schema).addValues(1, "Max").build()));
```

```
PCollection<Row> selectMax = input.apply(  
    SqlTransform.query("SELECT name FROM PCOLLECTION WHERE id=1"));
```

```
public static class MyData {  
    public int id;  
    public String name;  
}
```

# SQL Blueprint

```
Schema schema = POJUtils.schemaFromPojoClass(  
    OptionsTest.class,  
    JavaFieldSchema.JavaFieldTypeSupplier.INSTANCE);
```

```
PCollection<Row> input = pipeline  
    .apply(Create.of(Row.withSchema(schema).addValues(1, "Max").build()));
```

```
PCollection<Row> selectMax = input.apply(  
    SqlTransform.query("SELECT name FROM PCOLLECTION WHERE id=1"));
```



# Conclusion

# Apache Beam + Apache Flink

1. Unified API for batch and streaming
2. Programming language of your choice
3. ~~Execution engine~~ of your choice  
The robustness and speed of Apache Flink



# Thank you



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