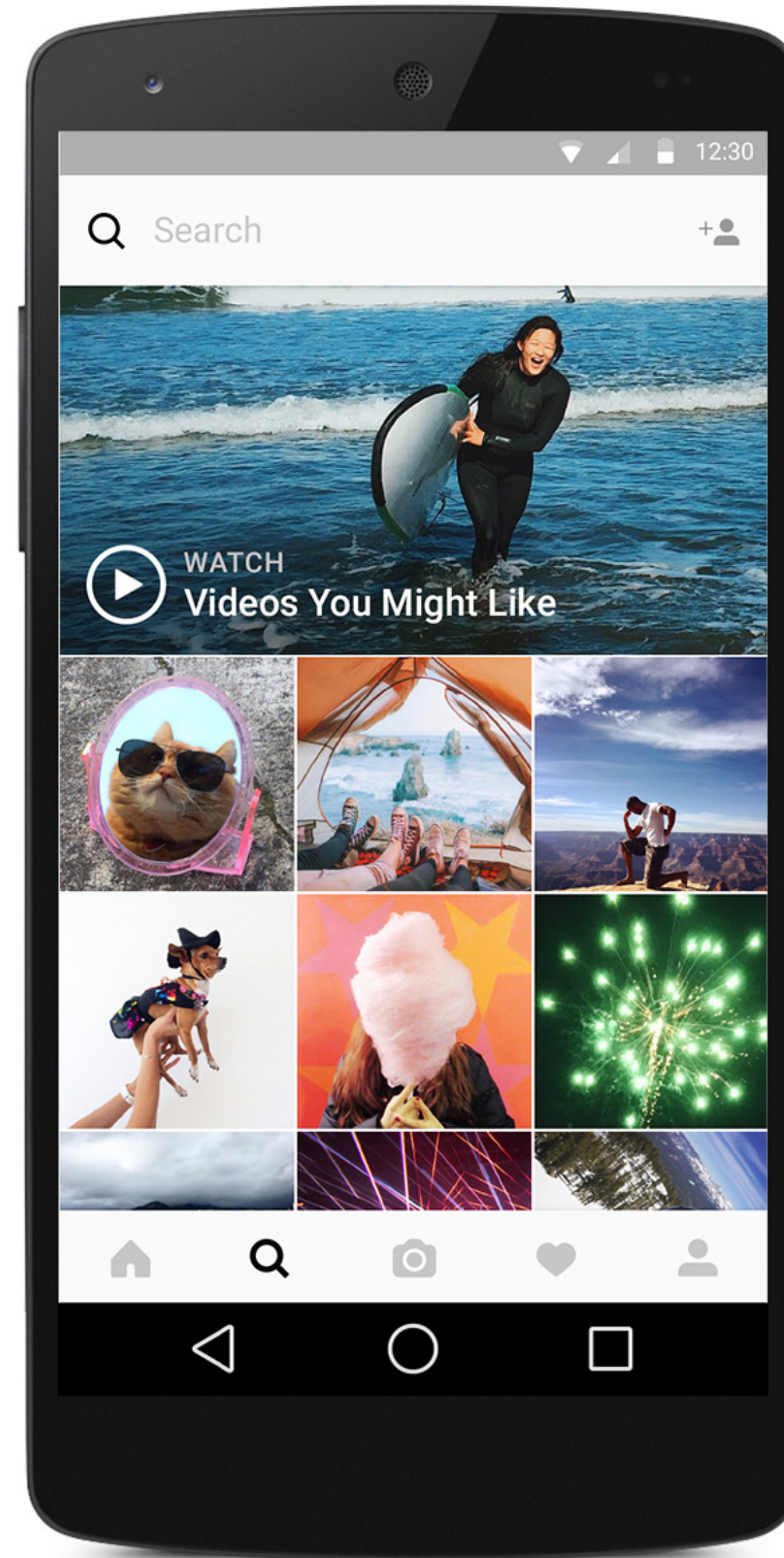




LESSONS LEARNED DEVELOPING AND MANAGING MASSIVE (300TB+) APACHE SPARK PIPELINES IN PRODUCTION

Brandon Carl



"SEE THE MOMENTS YOU CARE ABOUT FIRST"

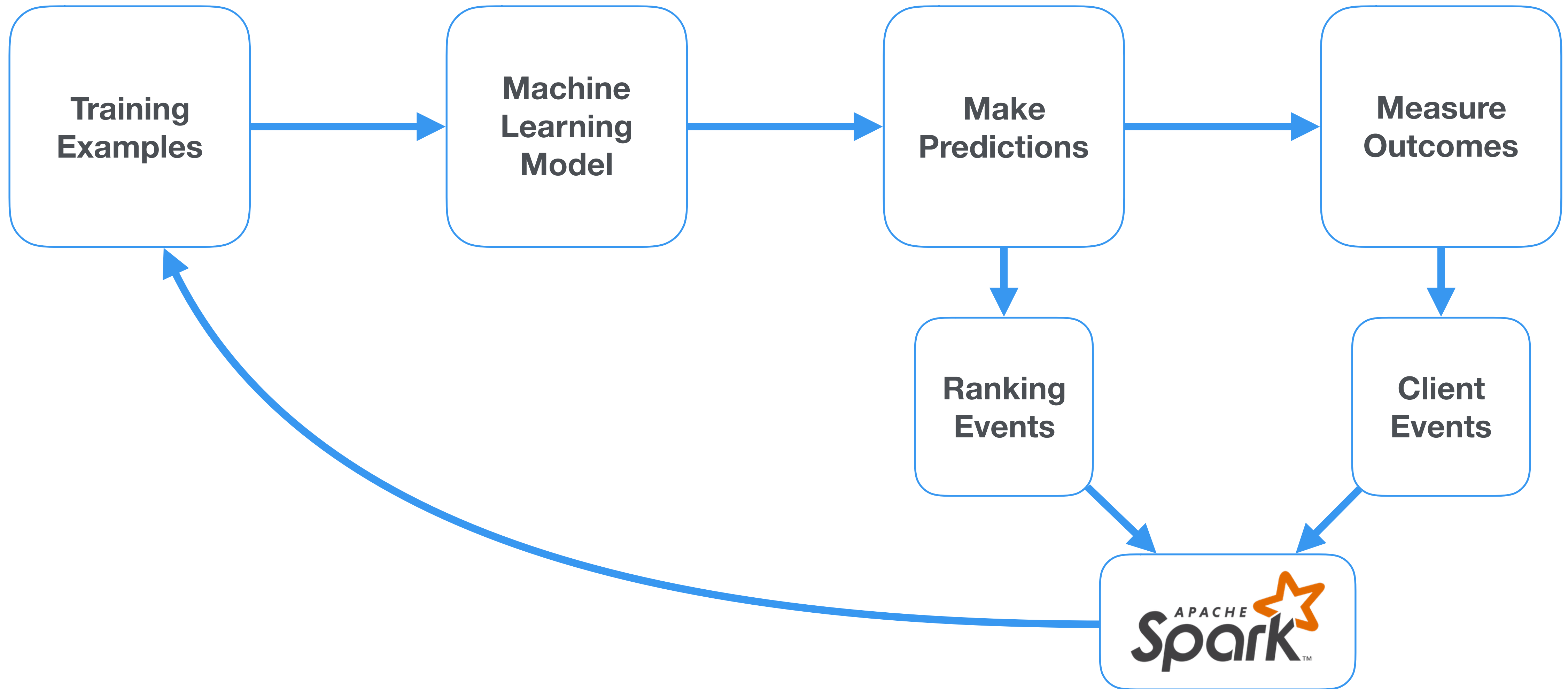
MARCH 15, 2016





MACHINE LEARNING

MACHINE LEARNING LIFECYCLE



WHY SPARK?

- Performance
- Testability
- Modularity
- Serialized Logging

SERIALIZED LOGGING

```
{  
  "id": 123,  
  "scores": {  
    "modelA": 0.2345,  
    "modelB": 0.0012  
  },  
  "features": {  
    1001: 0.9934,  
    1002: 0.1923  
  }  
}
```


SERIALIZED LOGGING

```
struct Candidate {  
    1: i64 id;  
    2: map<string, double> scores;  
    3: map<i64, double> features;  
}
```

```
new Candidate()  
    .setId(id)  
    .setScores(scores)  
    .setFeatures(features)
```



CHANGES OVER TIME

CHANGES OVER TIME

- RDD
- Dataset
- Training Data Joiner

TRAINING DATA JOINER

```
class MyTrainingDataJoiner(spark: SparkSession) extends TrainingDataJoiner {  
  val labels: Map[String, LabelFunction] = ???  
}
```

```
case class Output(id: Long, label_value: Double)
```



MANAGING MASSIVE SCALE



MANAGING MASSIVE SCALE – PEOPLE

AUTOMATE EVERYTHING

SIMPLE INTERFACE

SIMPLE INTERFACE

RankingEvent

```
.read('input_table', '2017-10-25')
```

```
.filter(...)
```

```
.map(...)
```

```
.write('output_table', '2017-10-25')
```

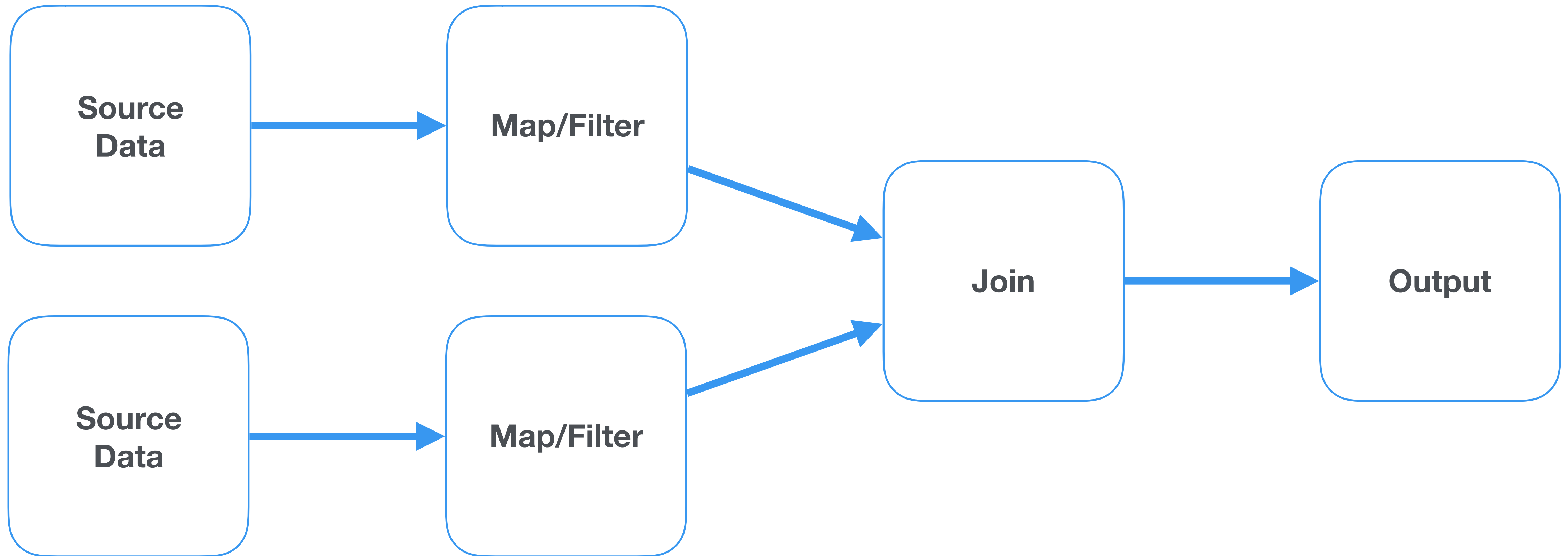



MANAGING MASSIVE SCALE – DATA

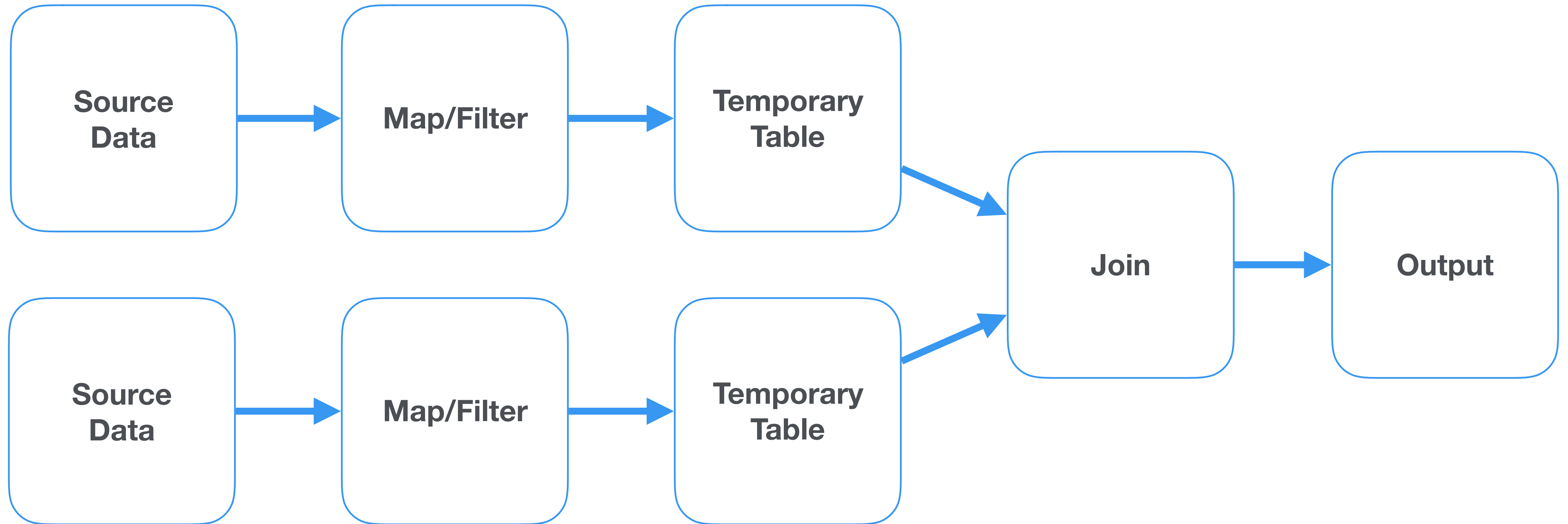
PLAN FOR GROWTH

PERSIST TO HDFS

PERSIST TO HDFS



PERSIST TO HDFS



KRYO SERIALIZATION

KRYO SERIALIZATION

```
new SparkConf()  
    .set("spark.serializer", "org.apache.spark.serializer.KryoSerializer")  
    .set("spark.kryo.registrationRequired", "true")  
    .registerKryoClasses(Array(classOf[...], ...))
```

BIG-O MATTERS

BIG-O MATTERS

```
final def withName(s: String): Value =  
  values  
    .find(_.toString == s)  
    .getOrElse(throw new NoSuchElementException(...))
```

BIG-O MATTERS

```
final def withName(s: String): Value =  
  values  
    .find(_.toString == s)  
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```

DATA STRUCTURES MATTER

DATA STRUCTURES MATTER

- AnyRefMap
- IntMap
- LongMap
- fastutil (<http://fastutil.di.unimi.it>)

DATA SKEW MATTERS

TEST ON SAMPLED DATA



