
Power Pig with Spark



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Agenda

- **Background**
- Why Pig on Spark ?
- Design Architecture
- Benchmark
- Optimization
- Current Status & Future Work
- Q&A

Background



The Largest Independent Mobile Ad Network

Apache Pig

- Procedural scripting language
- Pig Latin: similar to sql
- Heavily used for ETL
- Schema / No schema data, Pig eats everything

Spark

- Faster
- Generality
- Easy of use

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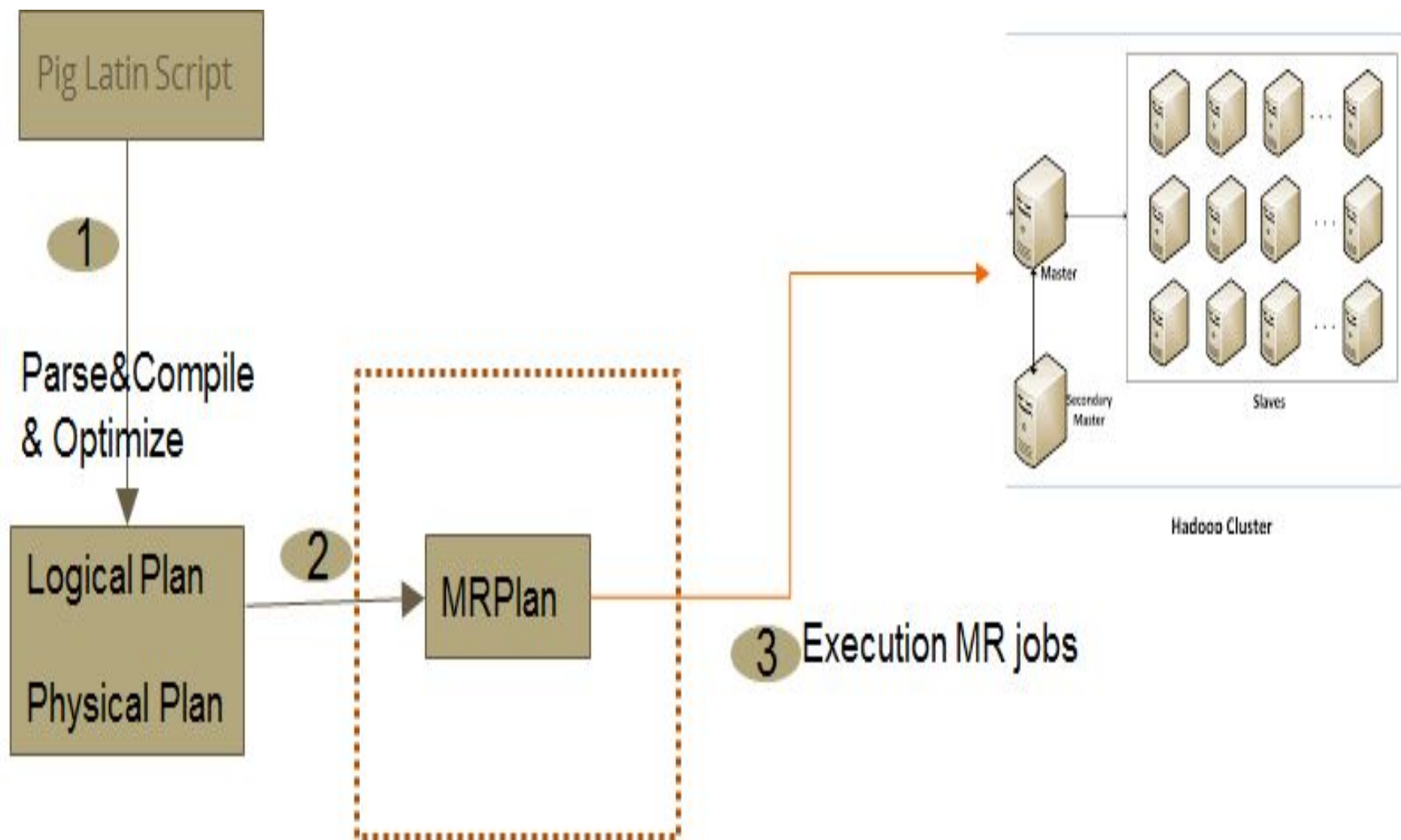
Why Pig on Spark

- Better Performance
 - No intermediate data between stages
 - In-memory caching abstraction
 - Executor JVM Reuse
- Support Pig users to experience Spark conveniently

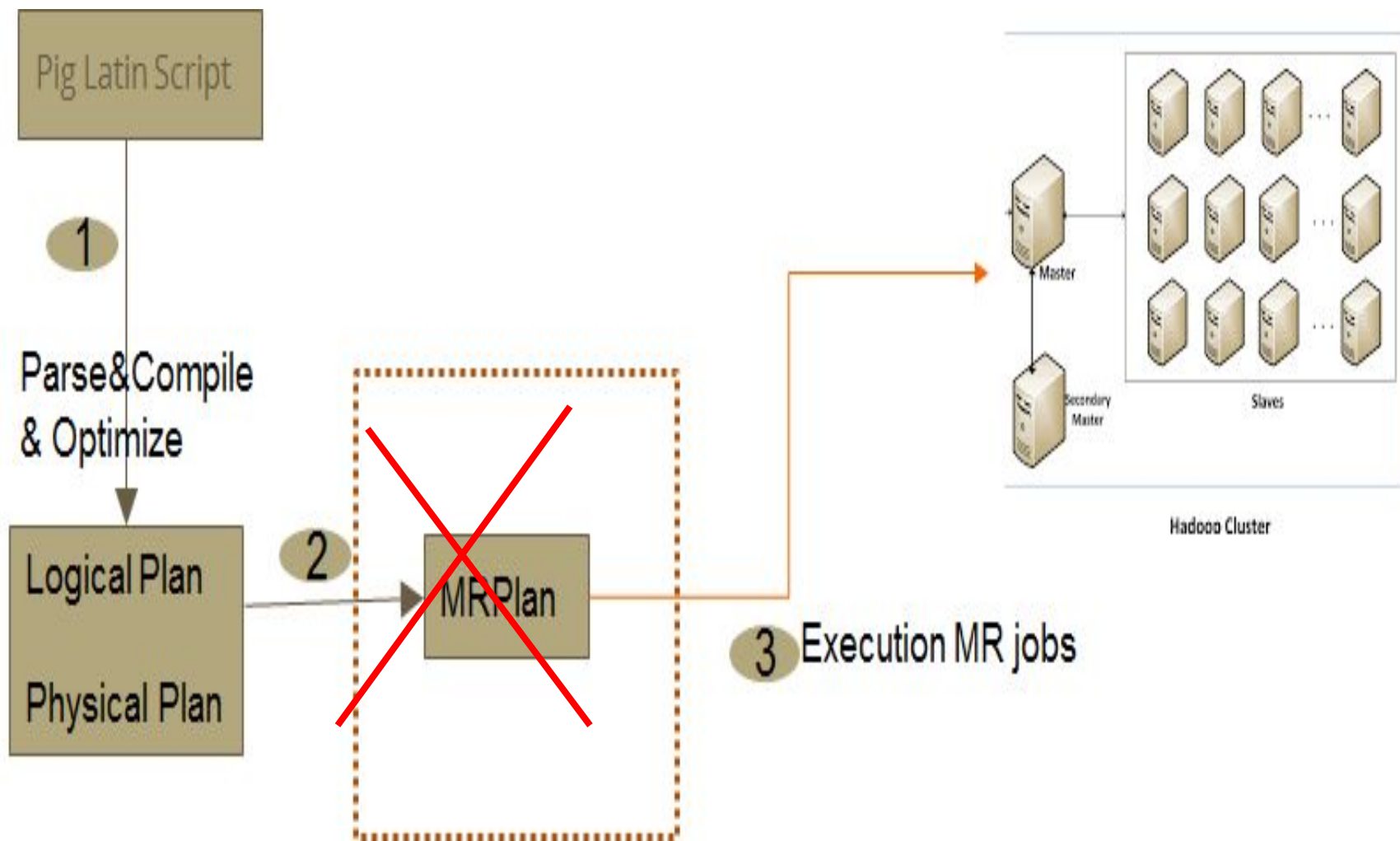
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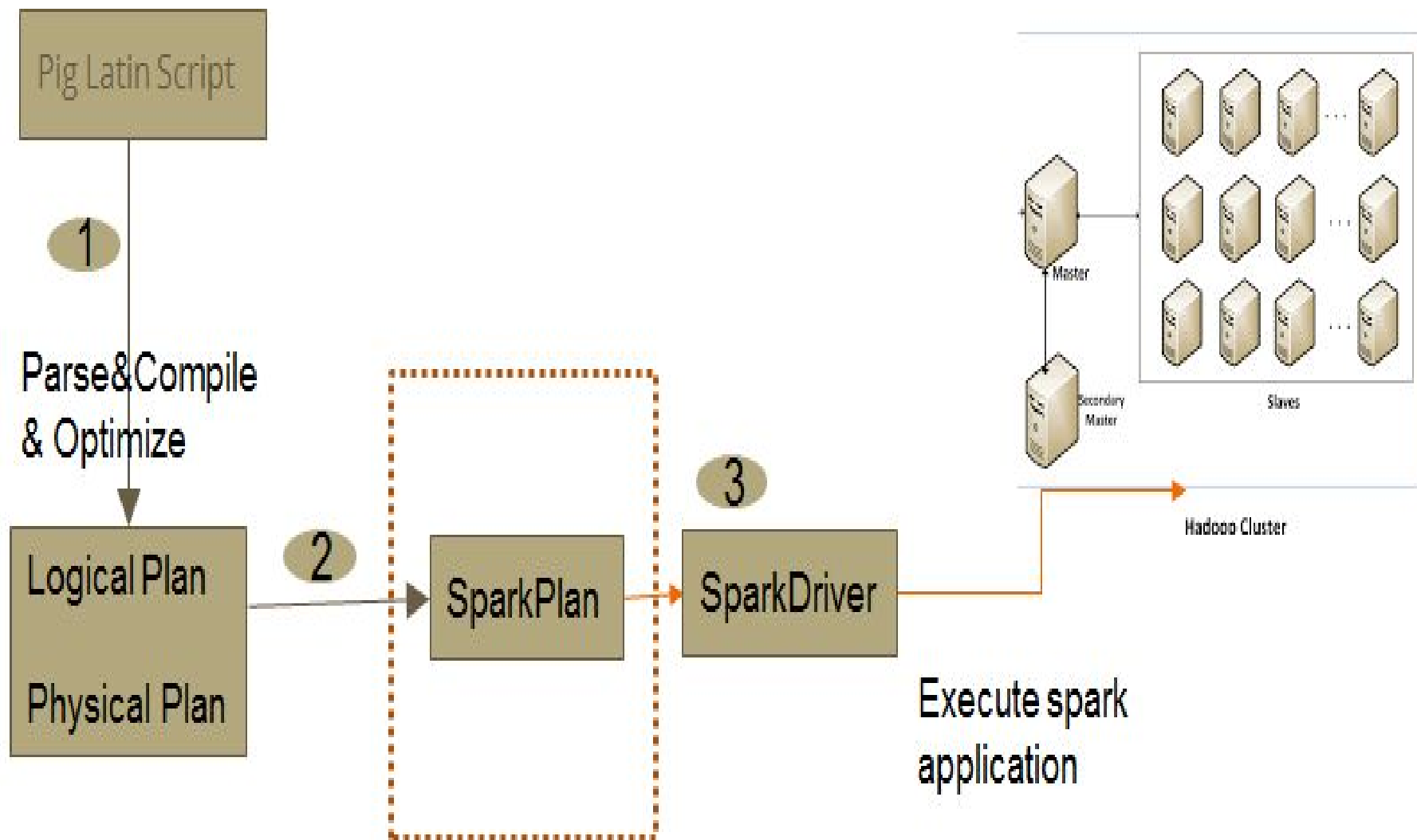
Design Architecture



Design Architecture



Design Architecture



Pig Latin to RDD<Tuple> transformations

Pig Latin

```
A = LOAD 'file1' AS (x,y,z);
```

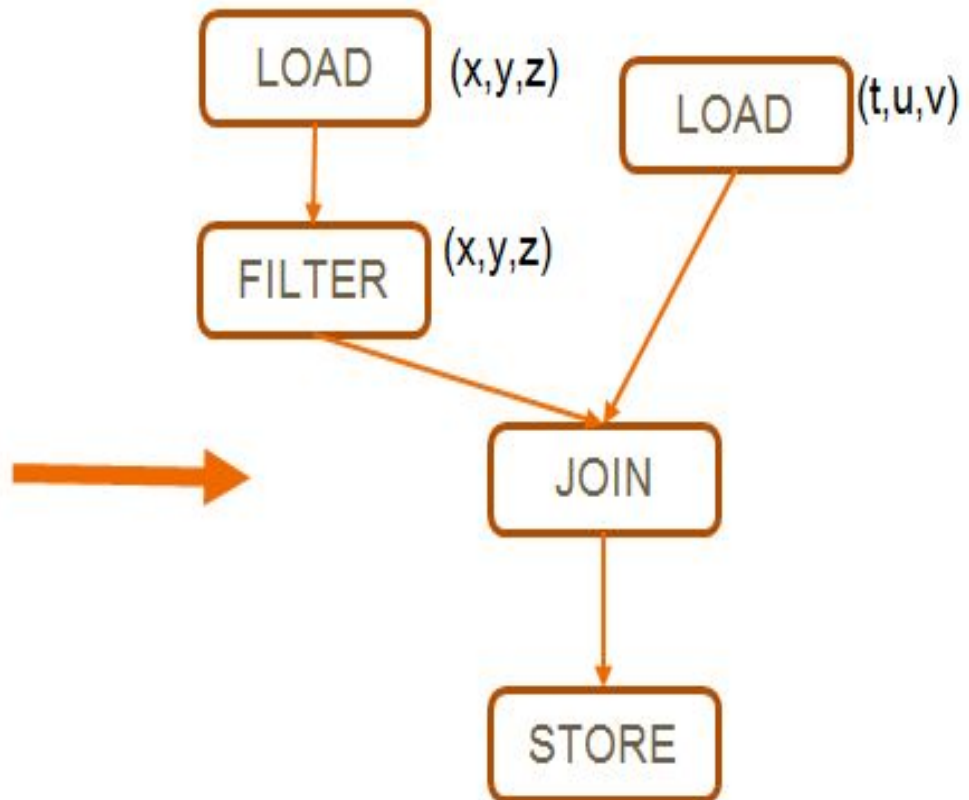
```
B = LOAD 'file2' AS (t,u,v);
```

```
C = FILTER A by y > 0;
```

```
D = JOIN C BY x, B BY u;
```

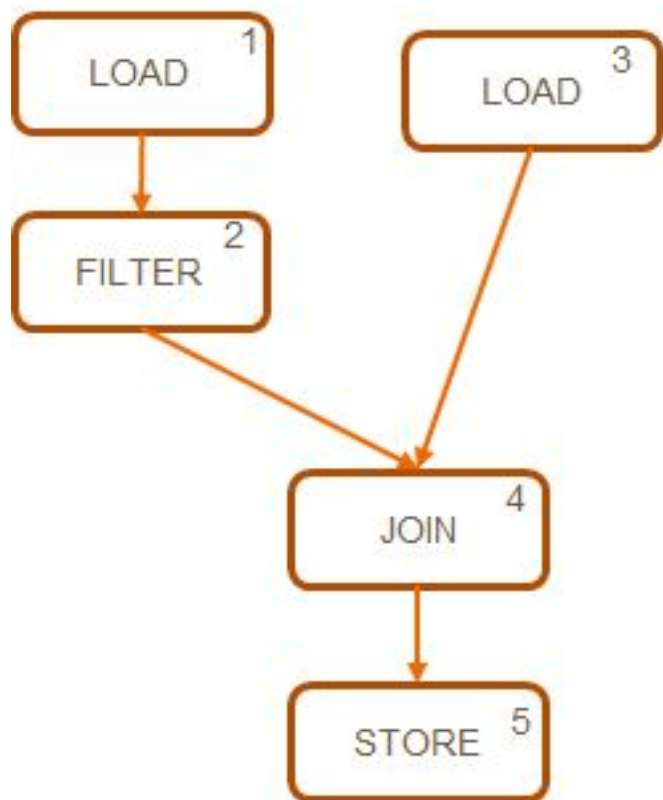
```
STORE D INTO 'output';
```

Logical Plan

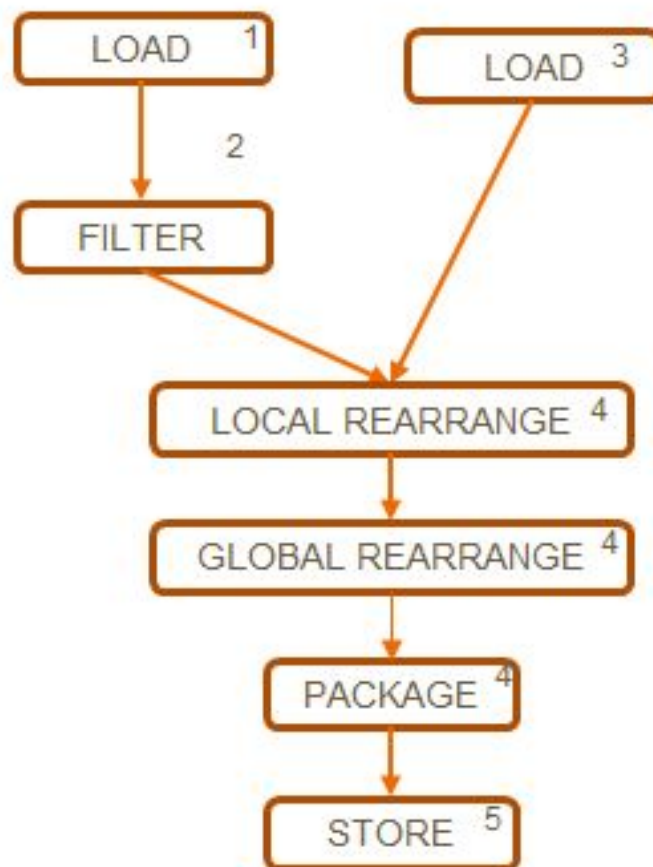


Pig Latin to RDD<Tuple> transformations

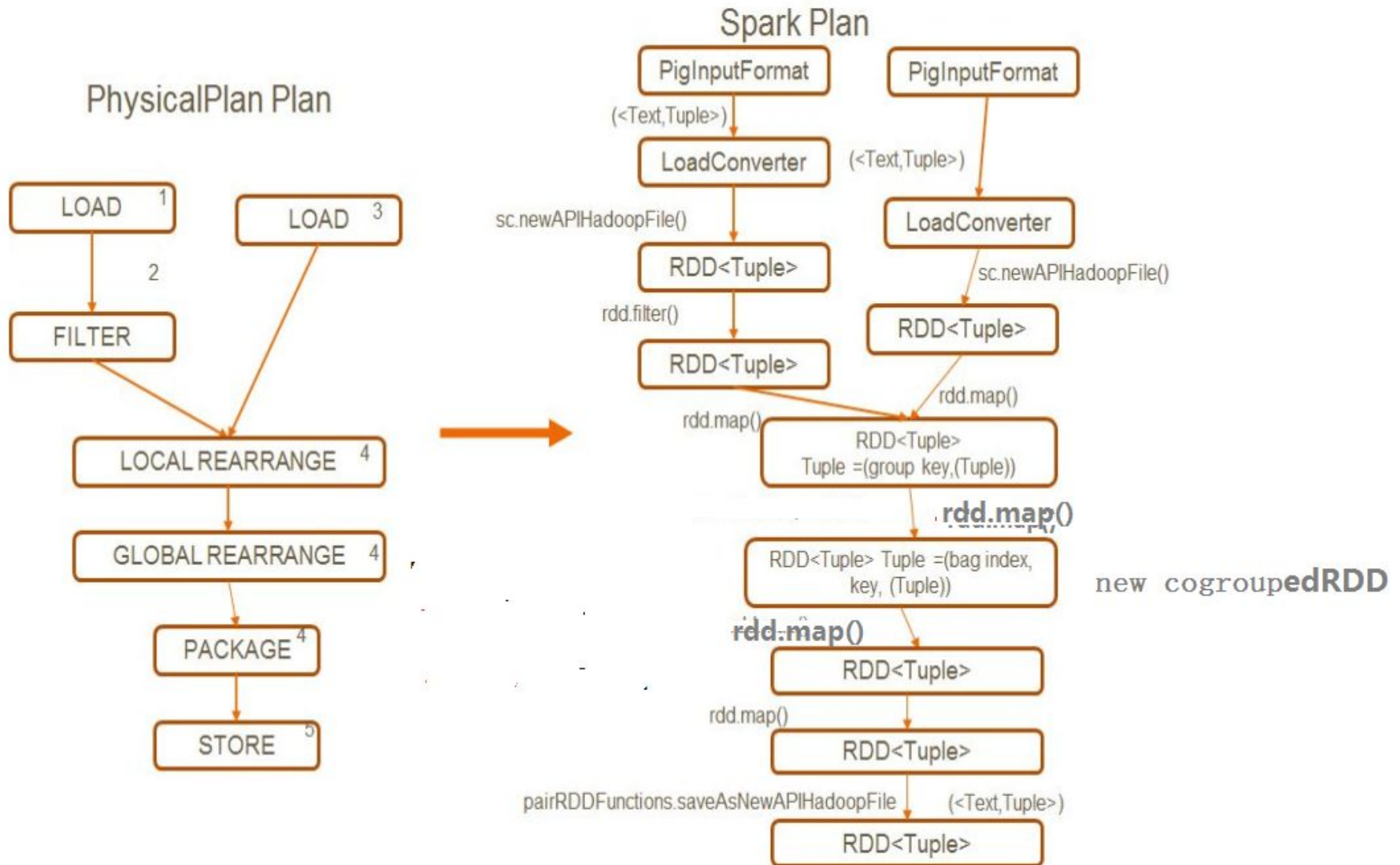
Logical Plan



PhysicalPlan



Pig Latin to RDD<Tuple> transformations



Operator Mapping

Pig Operator	Spark Operator
Load	newAPIHadoopFile
Store	saveAsNewAPIHadoopFile
Filter	filter
GroupBy	groupby/reduceBy
Join	CoGroupRDD
ForEach	mapPartitions
Sort	sortByKey

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Benchmark Overview

Component	Version
Pig	Spark branch
Hadoop	2.6.0
Spark	1.6.2
PigMix	Trunk

Basic Configuration

`spark.master=yarn-client`

`spark.executor.memory=6553m`

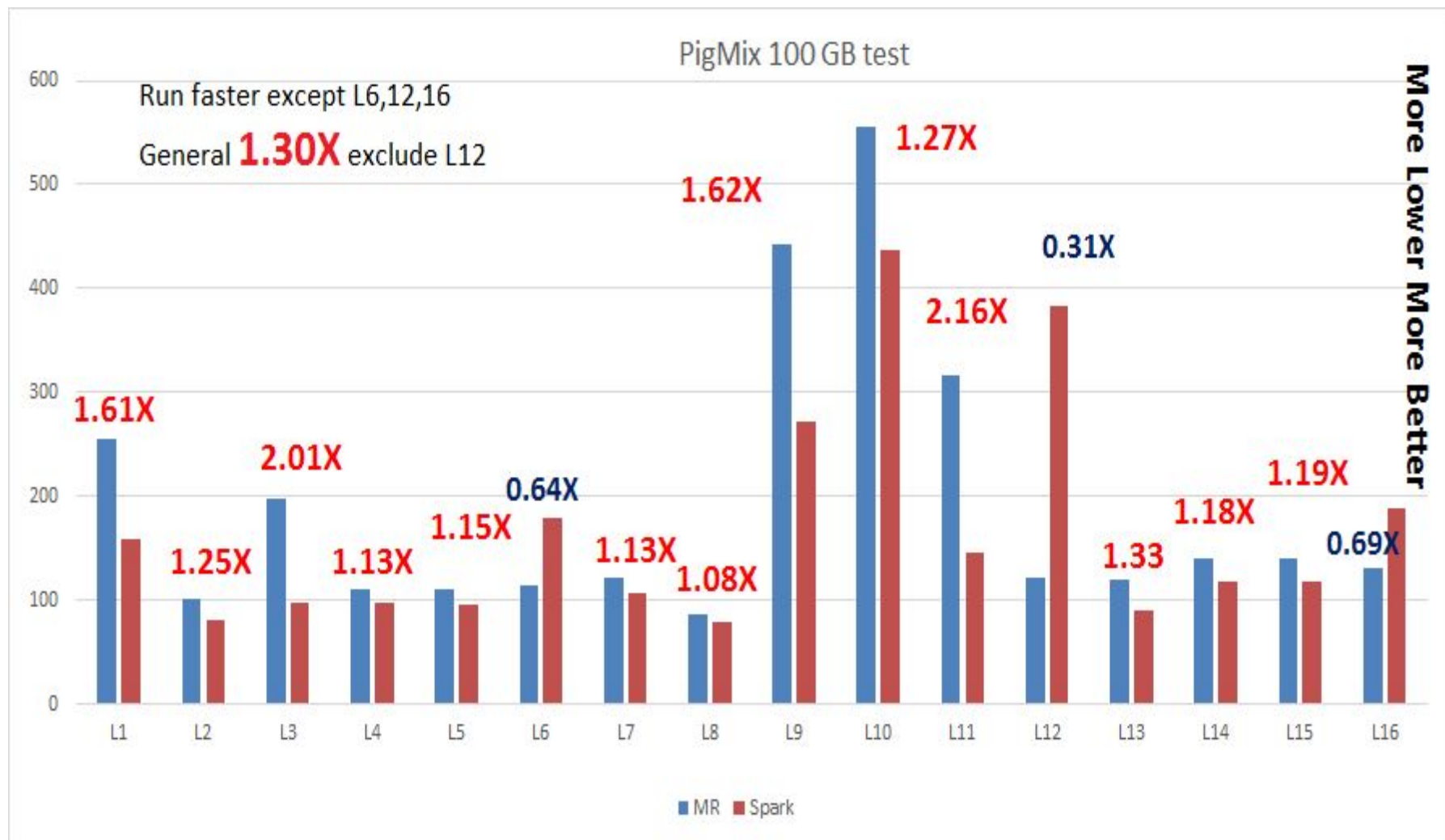
`spark.yarn.executor.memoryOverhead=1638`

`spark.executor.cores=8`

`spark.dynamicAllocation.enabled=true`

`spark.network.timeout=1200000`

Benchmark Overview (cont'd)

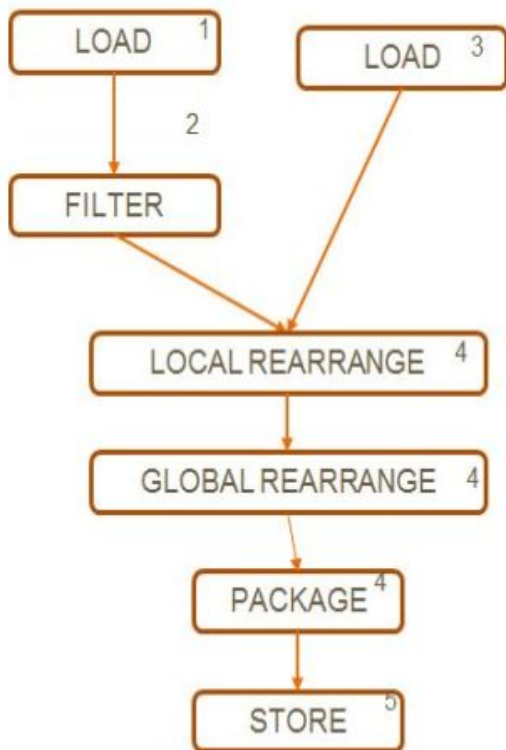


Agenda

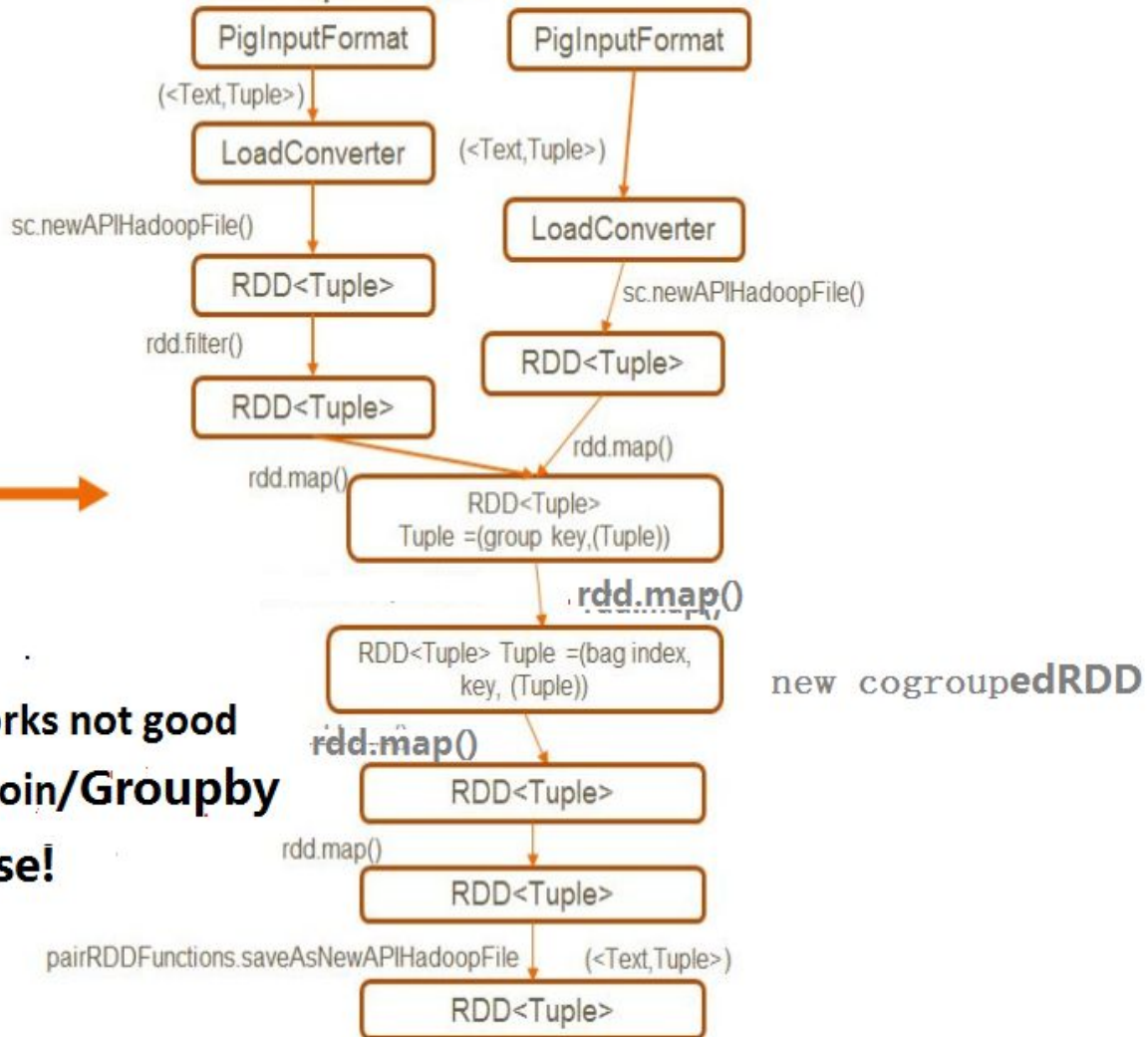
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Optimize GroupBy/Join

PhysicalPlan Plan

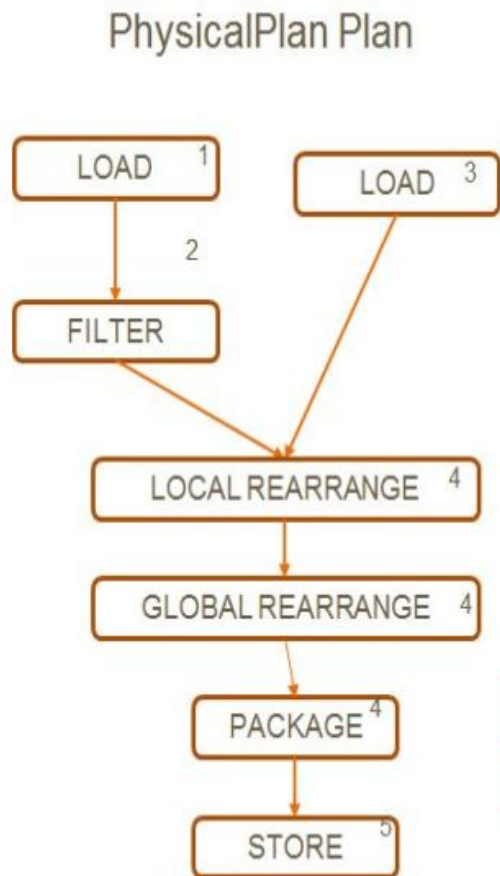


Spark Plan

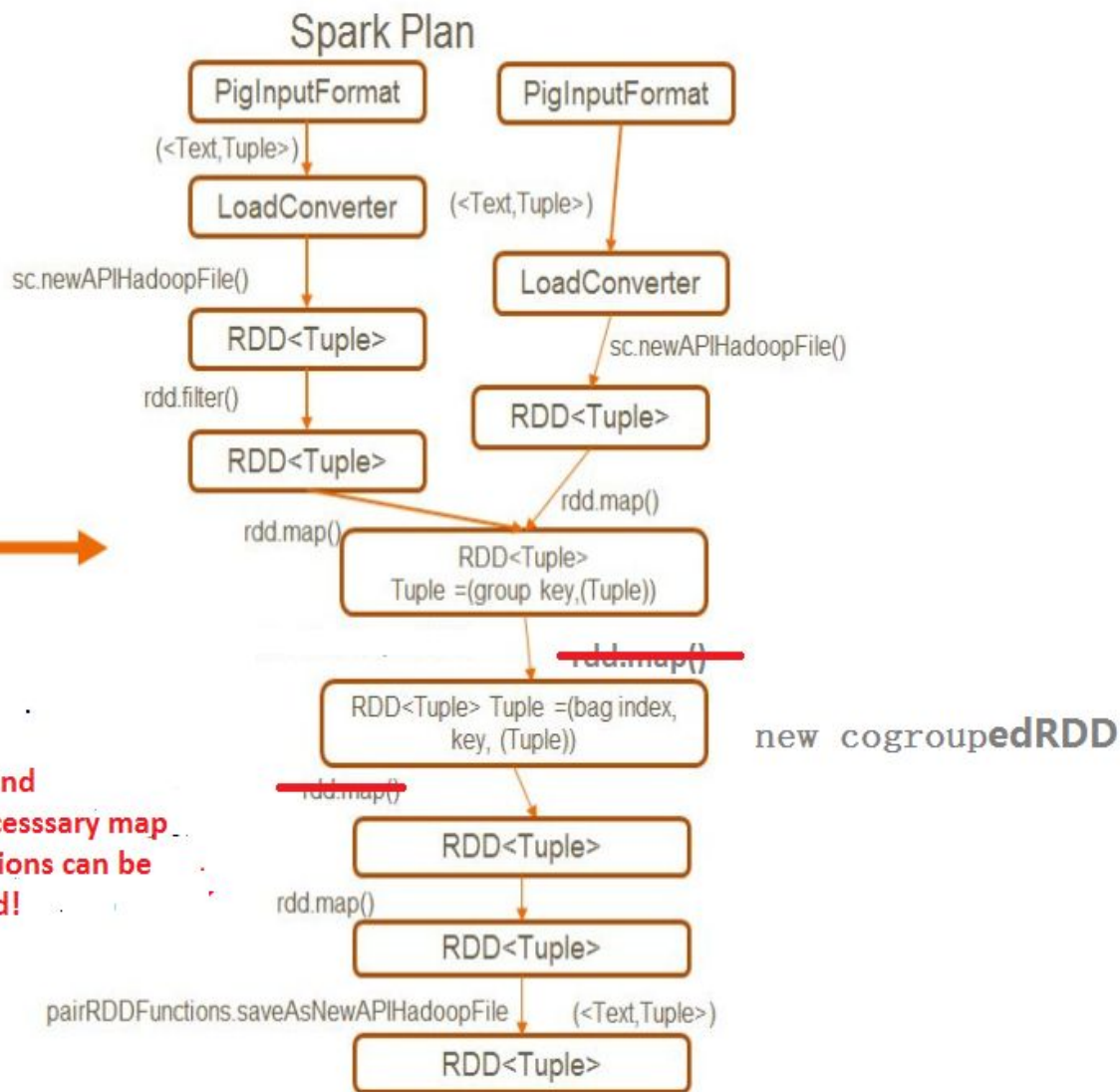


**Works not good
in Join/Groupby
case!**

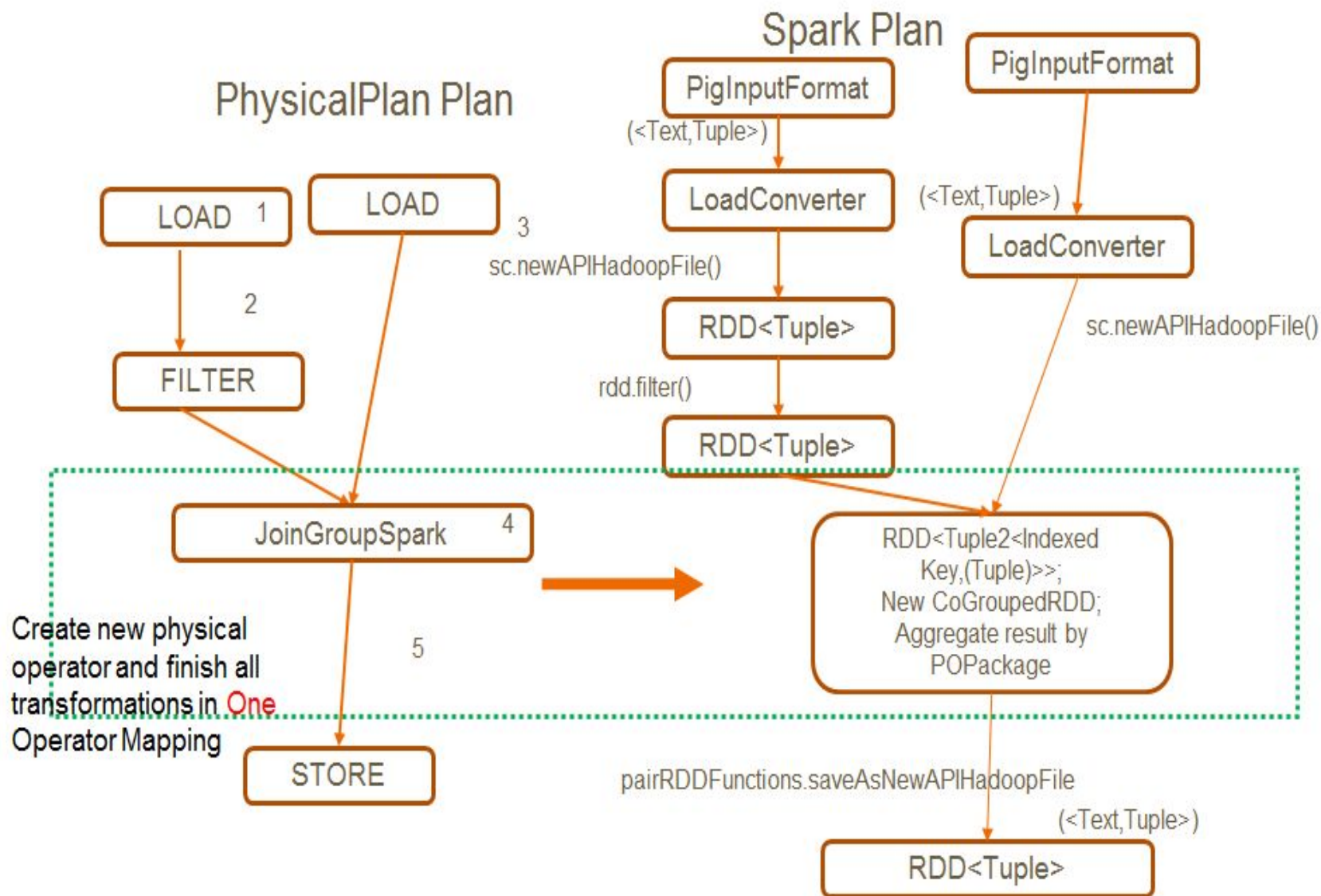
Optimize GroupBy/Join



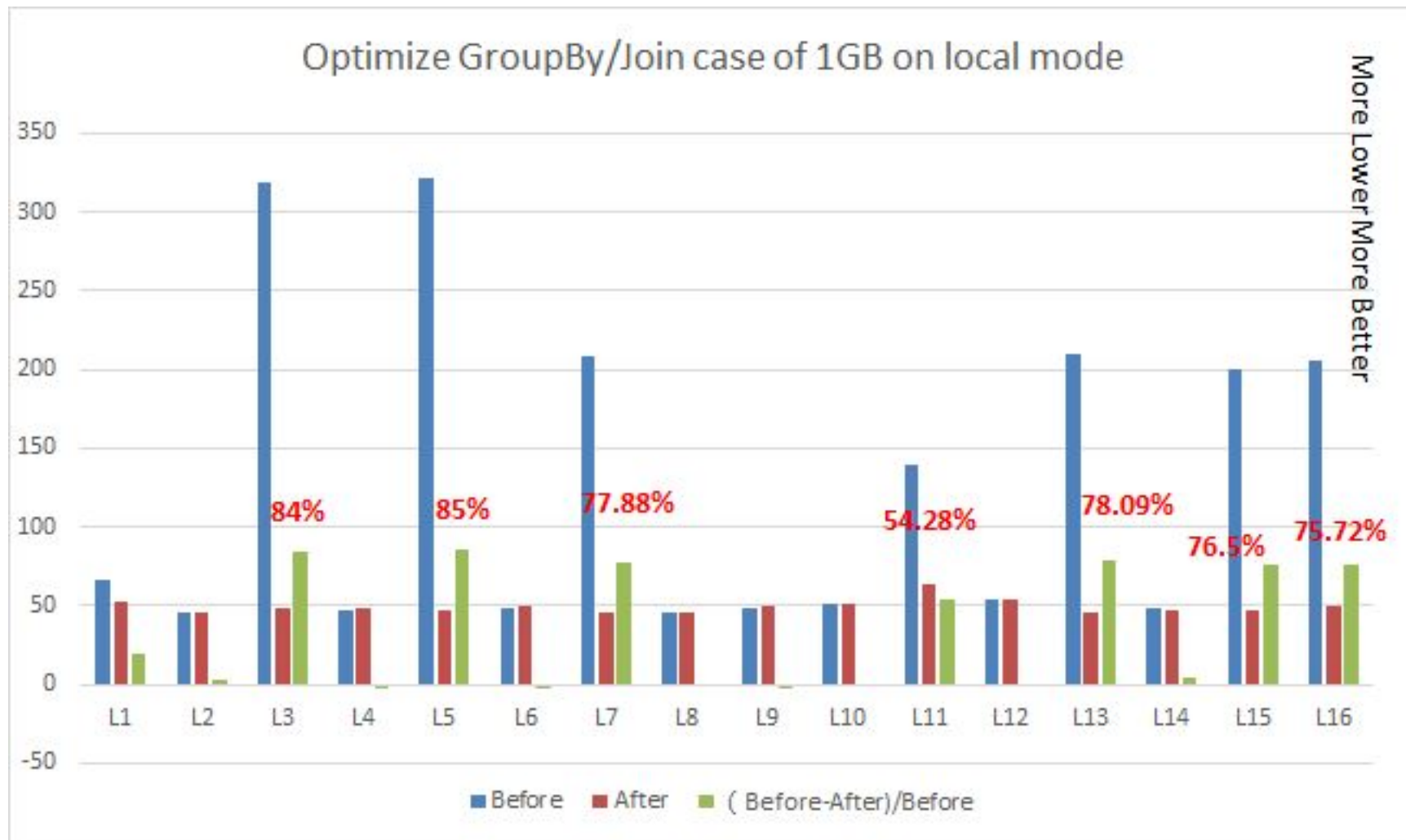
Huge and unnecessary map operations can be deleted!



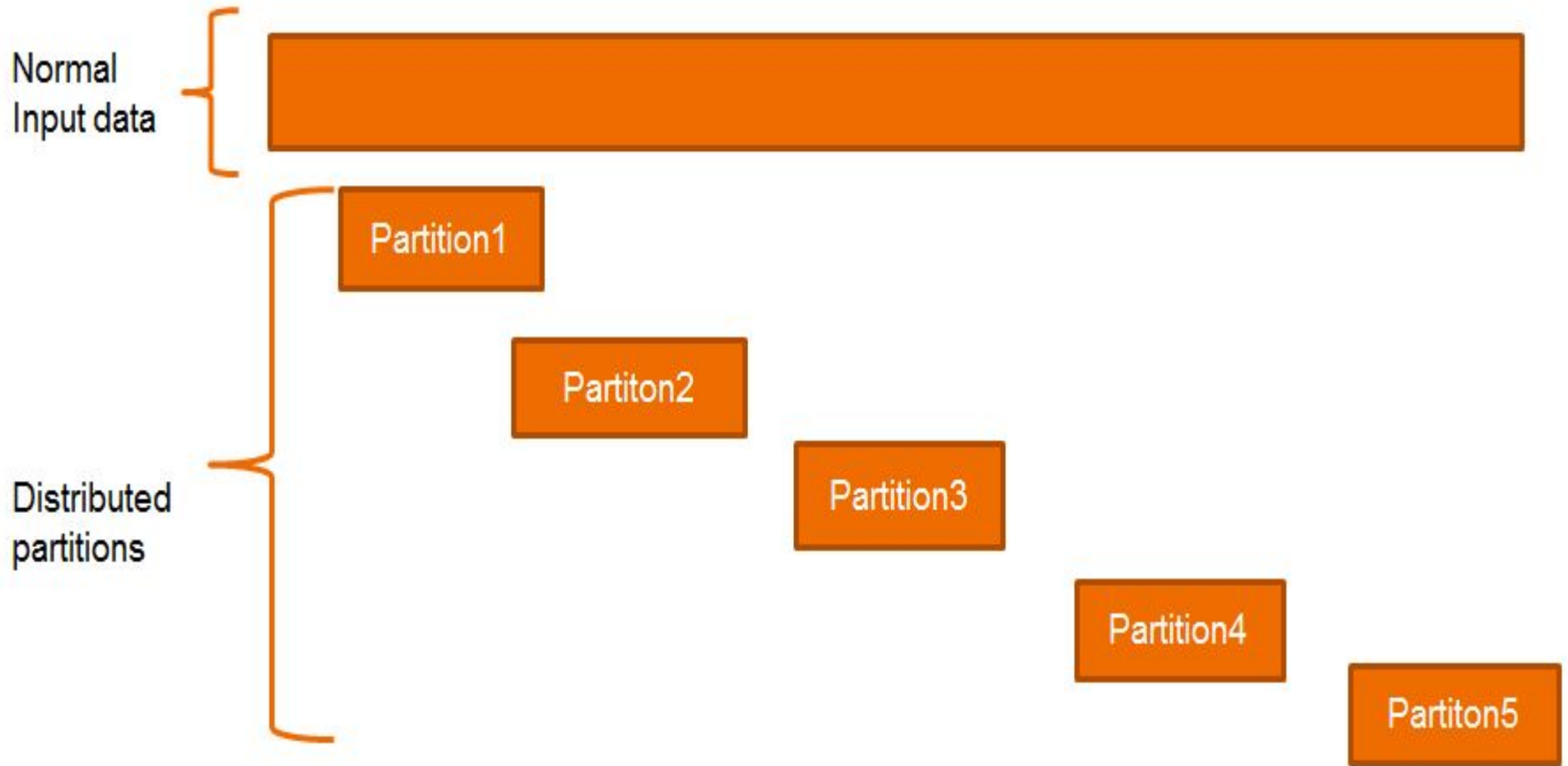
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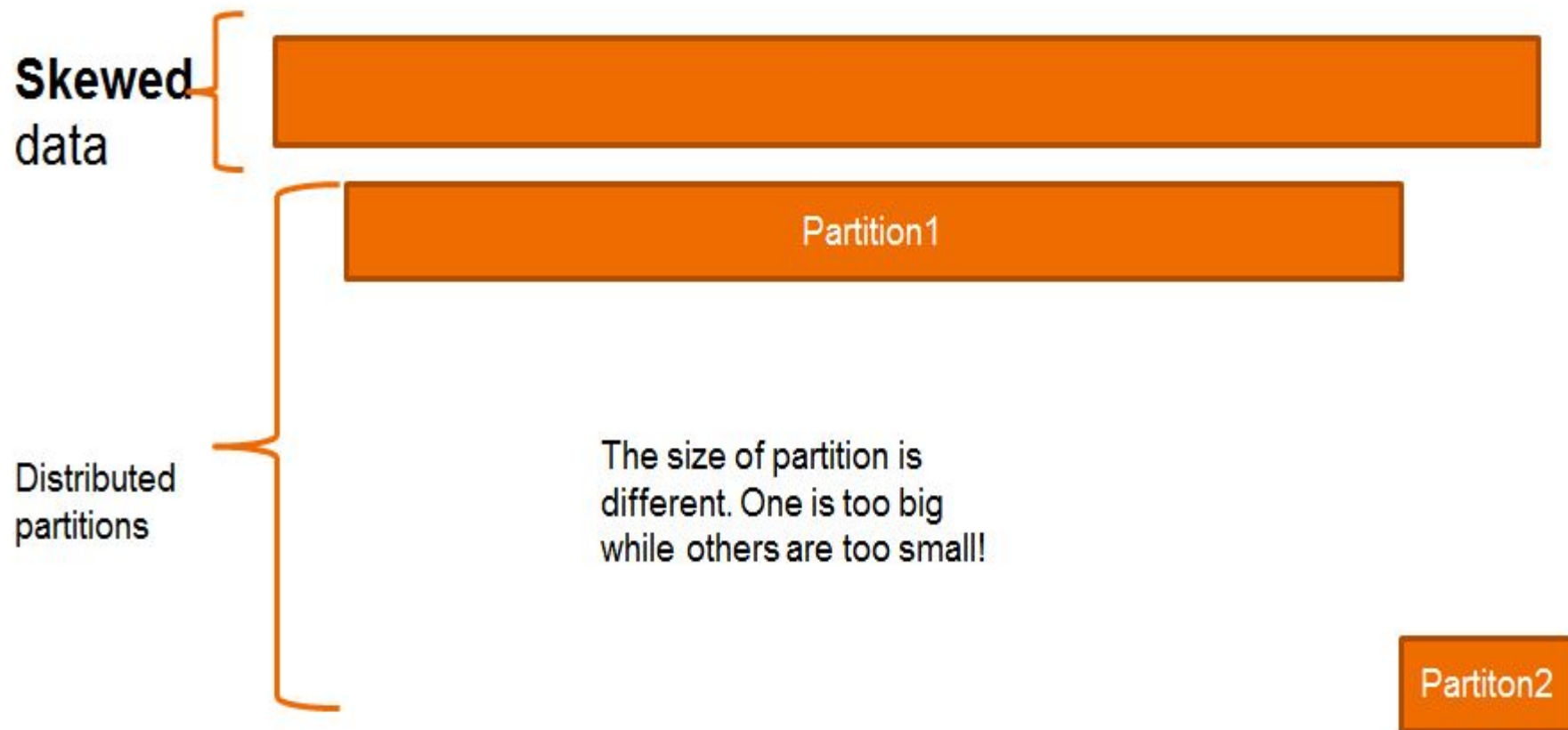
Optimize GroupBy/Join



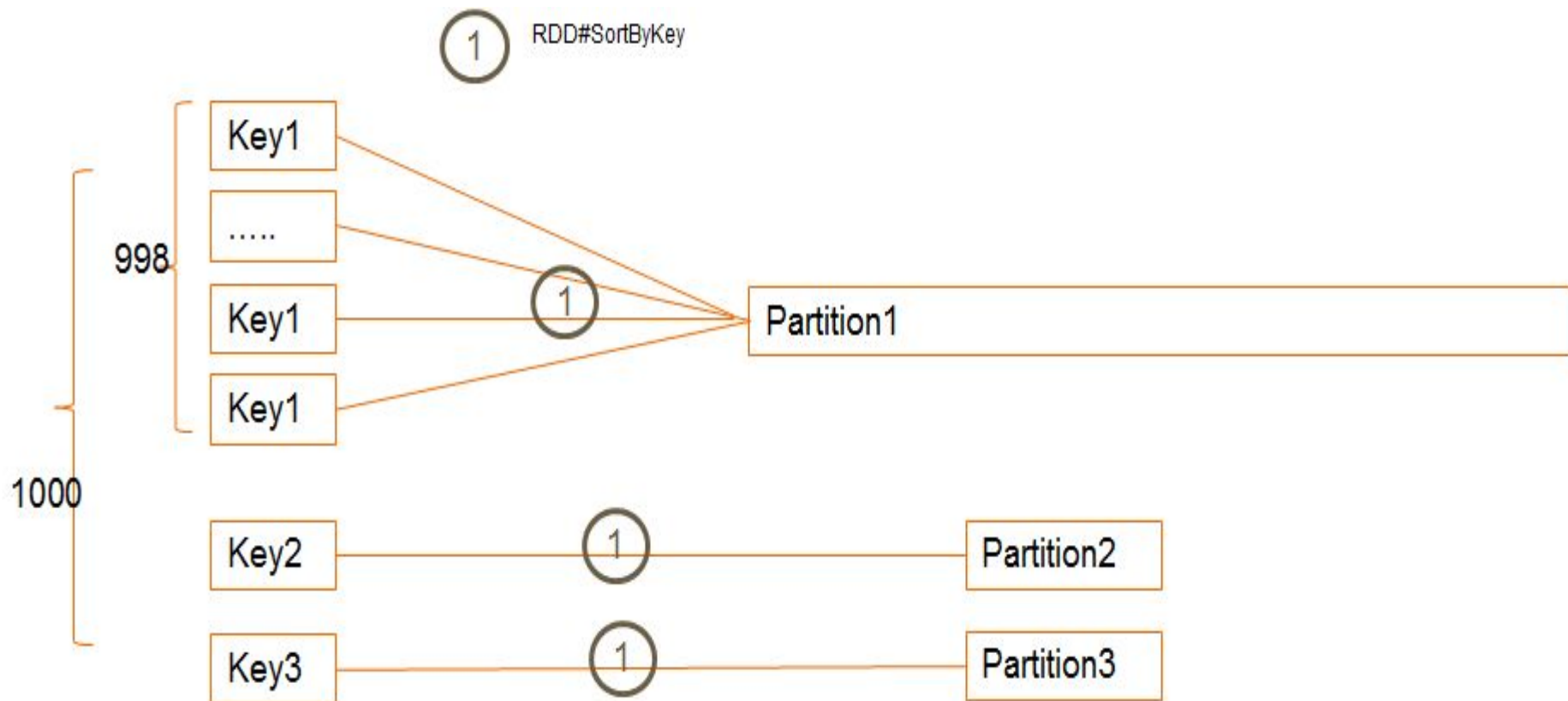
Skewed Key Sort



Skewed Key Sort

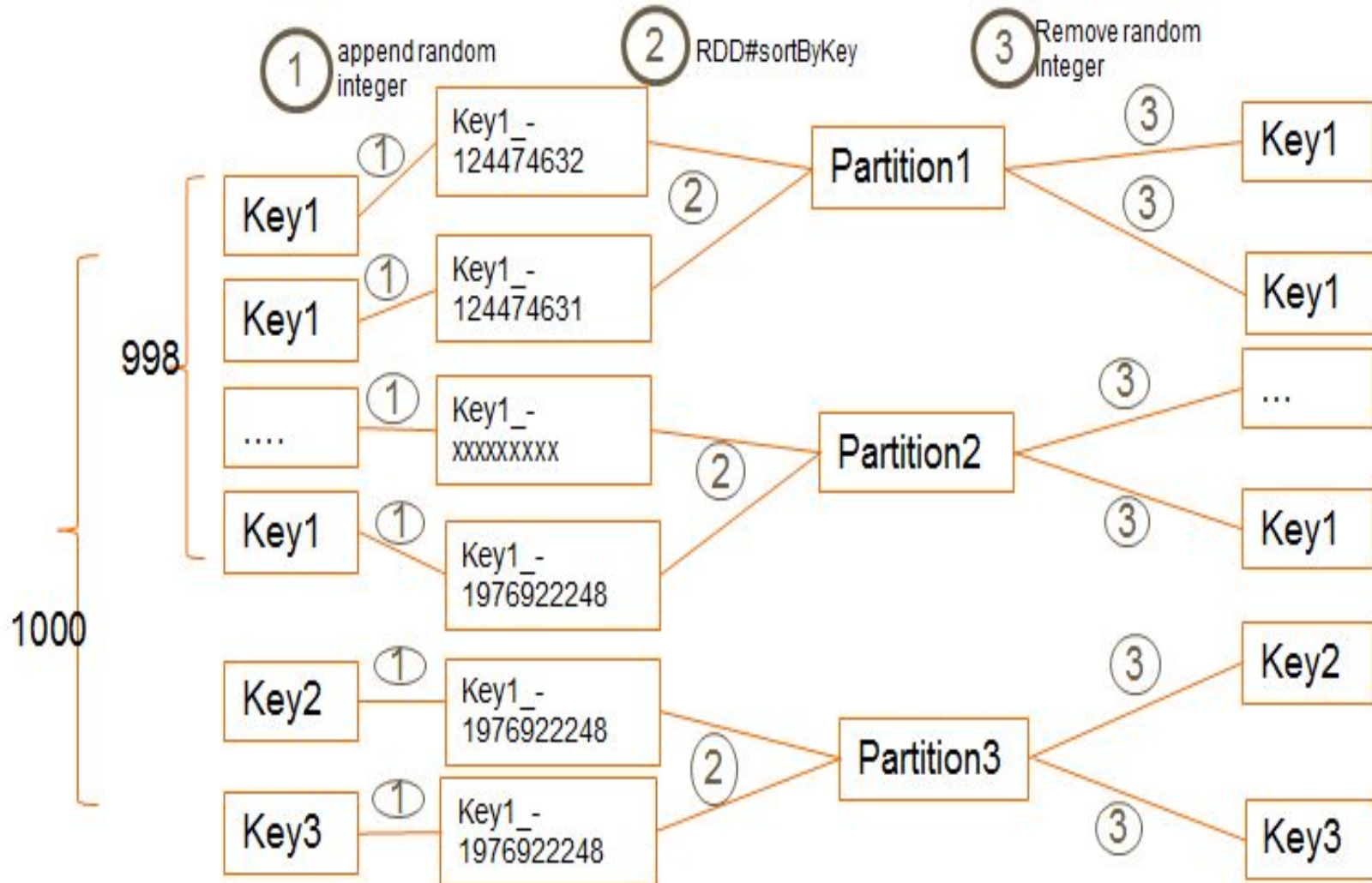


Skewed Key Sort

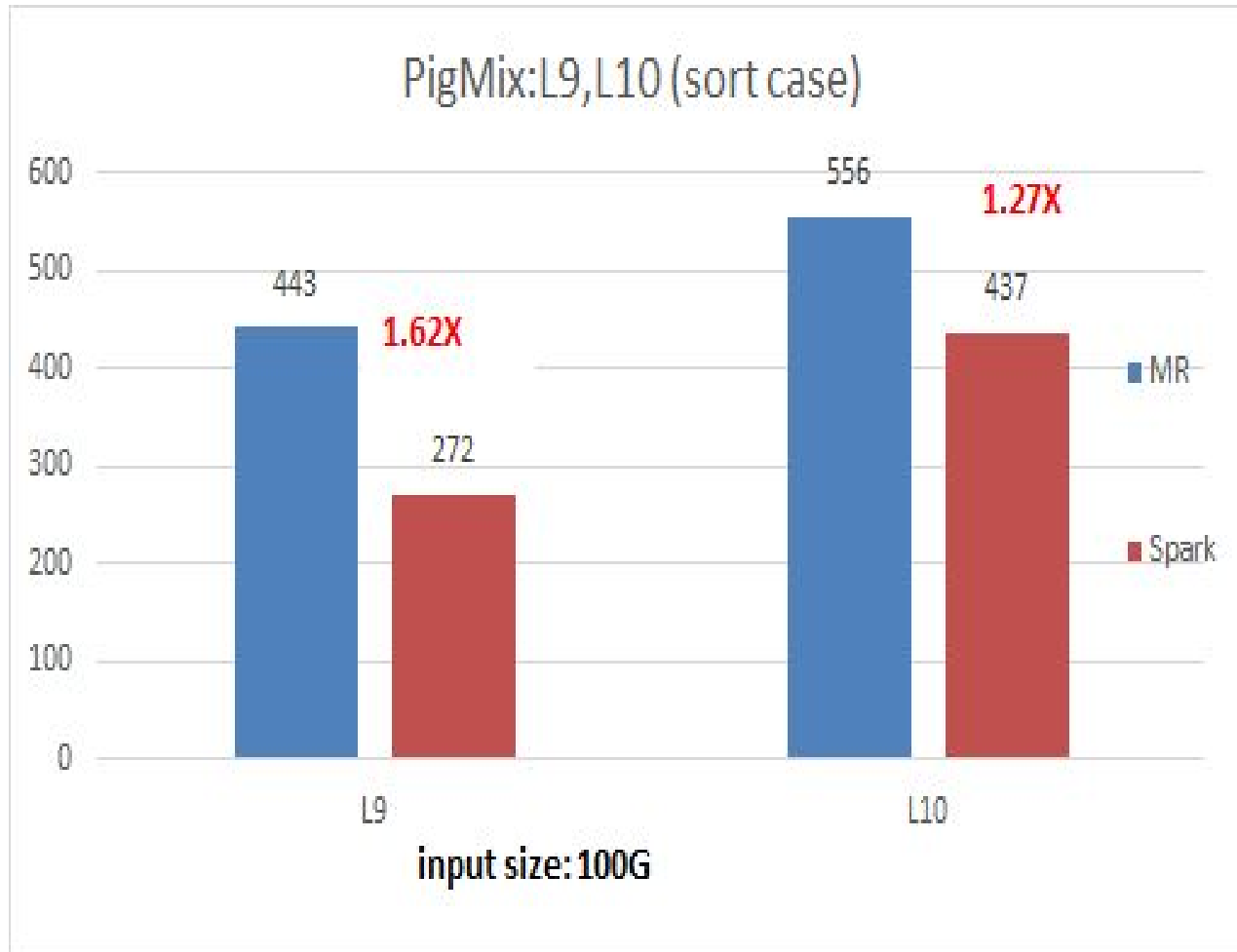


RangePartitioner used by
RDD.sortByKey works well ?

Salted Key Solution



Skewed Key Sort Performance



There are **significant** performance improvement in sort case(L10) and skewed key sort case(L9)

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Current Status: Nearing end of Milestone 1

- Functional completeness: DONE
- All Unit Tests Pass: DONE
- Merge Spark Branch to Master: In Code Review

Ongoing Work towards Milestone 2

- Implement Optimizations
 - Optimize Group by/Join - PIG-4797: DONE
 - FR Join - PIG-4771: DONE
 - Merge Join - PIG-4810: DONE
 - Skewed Join: UNDER REVIEW
- Enhance Test Infrastructure
 - Use “local-cluster” mode to run unit tests
- Spark Integration
 - Improved error, progress, stats reporting
 - YARN Cluster Mode

Future work: Milestone 3

- Implement More Optimizations
 - Split / MultiQuery using `RDD.cache()`
 - Compute optimal Shuffle Parallelism
 - Optimize/Redesign Spark Plan
- Code Stabilization, Bug Fixes

Contribution welcomed

- **Git:**

- <https://github.com/apache/pig/tree/spark>

- **Wiki :**

- <https://cwiki.apache.org/confluence/display/PIG/Pig+on+Spark>

- **Umbrella jira:**

- PIG-4059

Q&A