## CS 378 – Big Data Programming

Lecture 24
More on Partitions
Accumulators

### Review

- Assignment 11
  - Create user sessions
  - Order events by timestamp, event type, subtype
  - Order sessions by user ID
  - Partition sessions by city
  - Sample SHOWER sessions (1 in 10)

### Review

- Caching/persistence
  - Can delete/remove using: unpersist()

- Java instances as closures
  - Can reference static variables defined in the enclosing lexical scope
  - Can reference final local variables of the enclosing method

 Prudent partitioning can greatly reduce the amount of communication (shuffle)

- If an RDD is scanned only once, no need
- If an RDD is reused multiple times in keyoriented operations
  - Partitioning can improve performance significantly

Figure 4-4, from Learning Spark

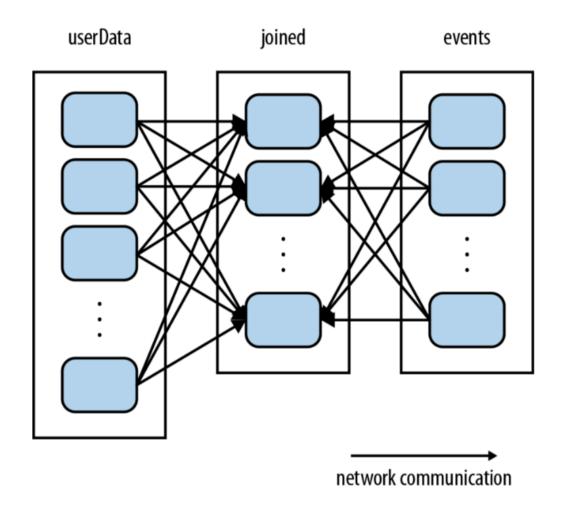
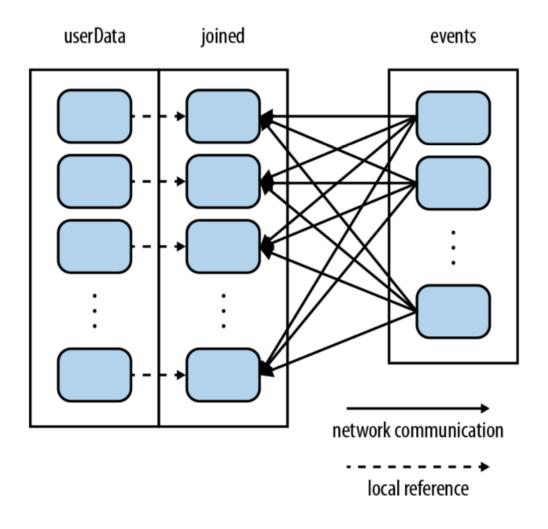


Figure 4-5, from Learning Spark



 Once an RDD is created with partitionBy() or other transformation that implicitly partitions the result,

 You should persist the RDD, otherwise the partitioning will be repeated on the next action

- Some transformations automatically return an RDD with known partitioning
- sortByKey() range partitioned
- groupByKey() hash partitioned

- Some transformations "forget" parent partitioning. Why?
  - map()

## Benefits of Partitioning

- Many transformations shuffle data across the network
- All these will benefit from partitioning
  - cogroup()
  - groupWith()
  - join()
  - leftOuterJoin()
  - rightOuterJoin()

## Benefits of Partitioning

- And these will benefit from partitioning
  - groupByKey()
  - reduceByKey()
  - combineByKey()
  - -lookup()

## Benefits of Partitioning

- Transformations on a single, partitioned RDD
  - Computed locally on a machine
  - A reduced result is sent to the master machine

- Binary transformations like cogroup(), join()
  - Prepartitioning will cause one RDD not to be shuffled
  - If both RDDs have the same partitioner and are on the same machine (e.g., from mapValues ())
  - No shuffling will occur

Which partitioner is set on output?

- Depends on the parent RDDs' partitioners
- By default, hash partitioner
  - Number of partitions is the level of parallelism
- If one parent has an explicit partitioner
  - Use it
- If both have an explicit partitioner, use the first

- To maximize the potential for partitioningrelated optimizations, instead of map() use
- mapValues()
- flatMapValues()

- Why?
  - They preserve the key

#### **Custom Partitioners**

- Partitioners used by default:
  - HashPartitioner
  - RangePartitioner
- Custom partitioner
  - Subclass Partitioner
  - Implement the required methods
    - numPartitions()
    - getPartition(key)
    - equals()

### Accumulators

- In our session generator app,
- Suppose we wanted to count the number of sessions that are sampled (SHOWER, 1 in 10)

How would we do this?

How did we do this using Hadoop map-reduce?

#### Accumulators

 An accumulator provides a means for aggregating values from worker nodes back to the driver node.

Create an accumulator from the Spark context

 Increment the accumulator in functions passed to worker nodes

### Accumulators

For failures or re-evaluation, what happens?

- Actions:
  - Each task's update applied only once

- Transformations:
  - No guarantee that task updates applied only once
  - Re-evaluation will update accumulator each time