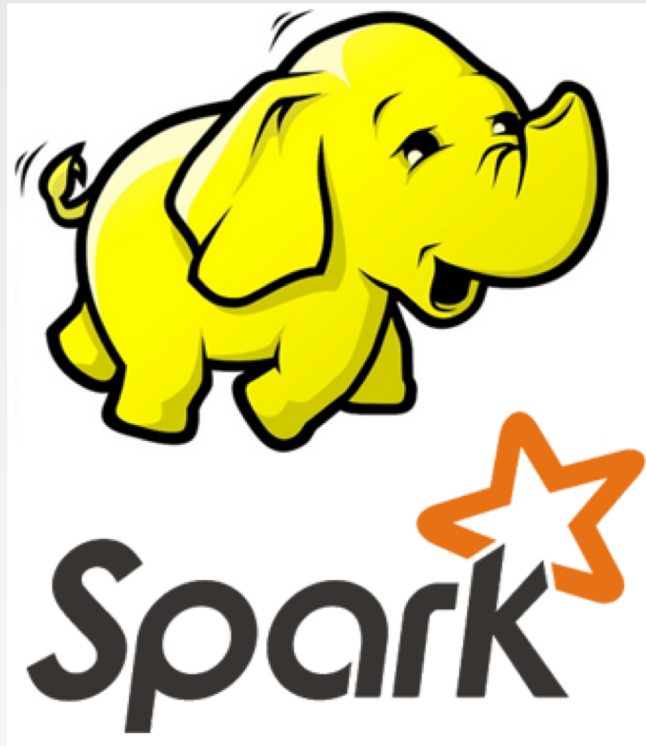


COMP9313: Big Data Management

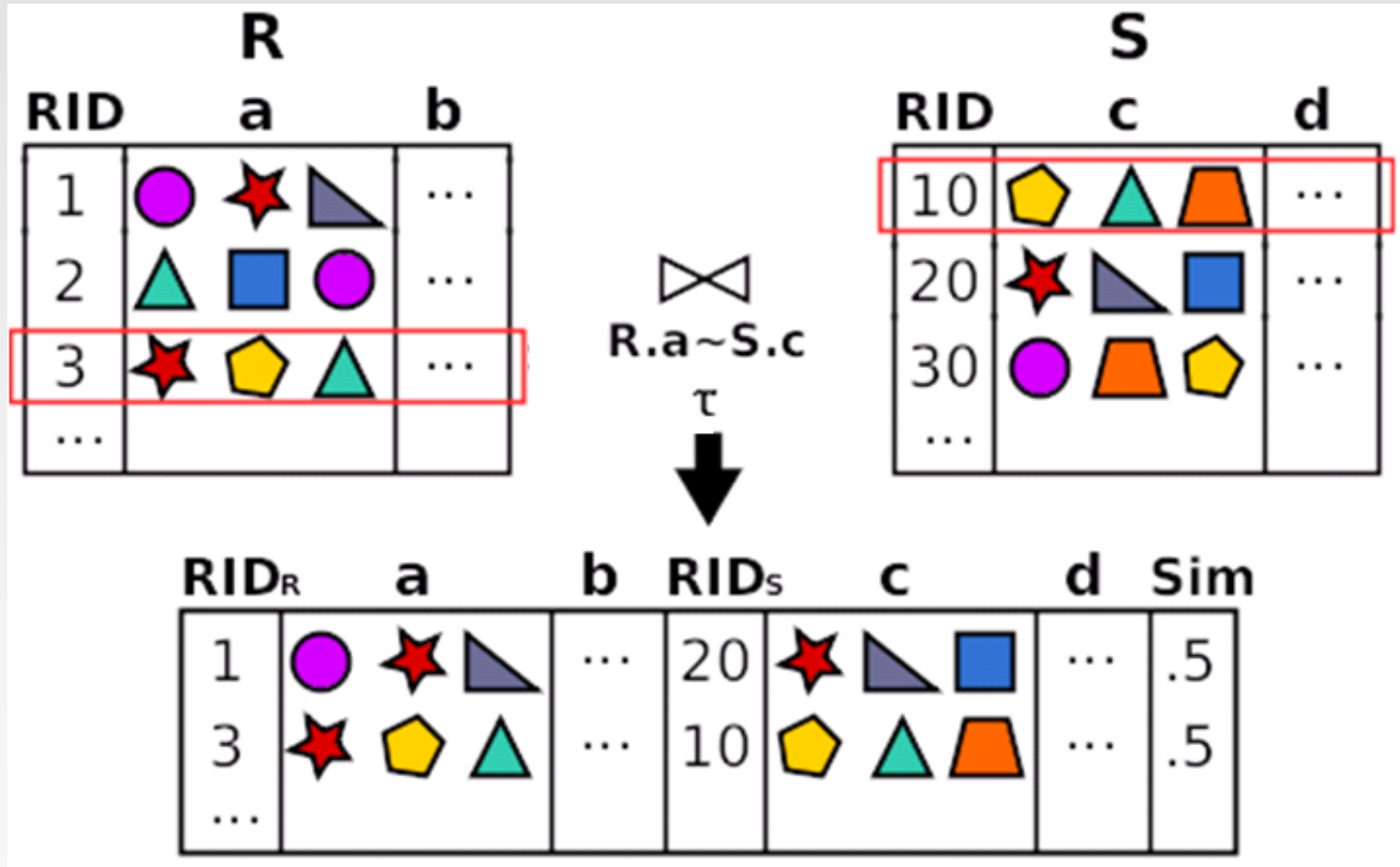


Lecturer: Xin Cao

Course web site: <http://www.cse.unsw.edu.au/~cs9313/>

Set Similarity Join on Hadoop

Set-Similarity Join



Finding pairs of records with a **similarity** on their join attributes $> t$

Application: Record linkage

Table R

| Star |
|----------------|
| Keanu Reeves |
| Samuel Jackson |
| Schwarzenegger |
| ... |

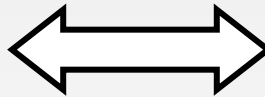


Table S

| Star |
|--------------------------|
| Keanu Reeves |
| Samuel L. Jackson |
| Schwarzenegger |
| ... |

Two-step Solution

Table R

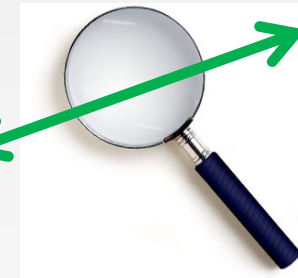
| Star |
|------|
| |
| |
| |
| |
| ... |

Step 1:
Similarity Join



Table S

| Star |
|------|
| |
| |
| |
| |
| ... |



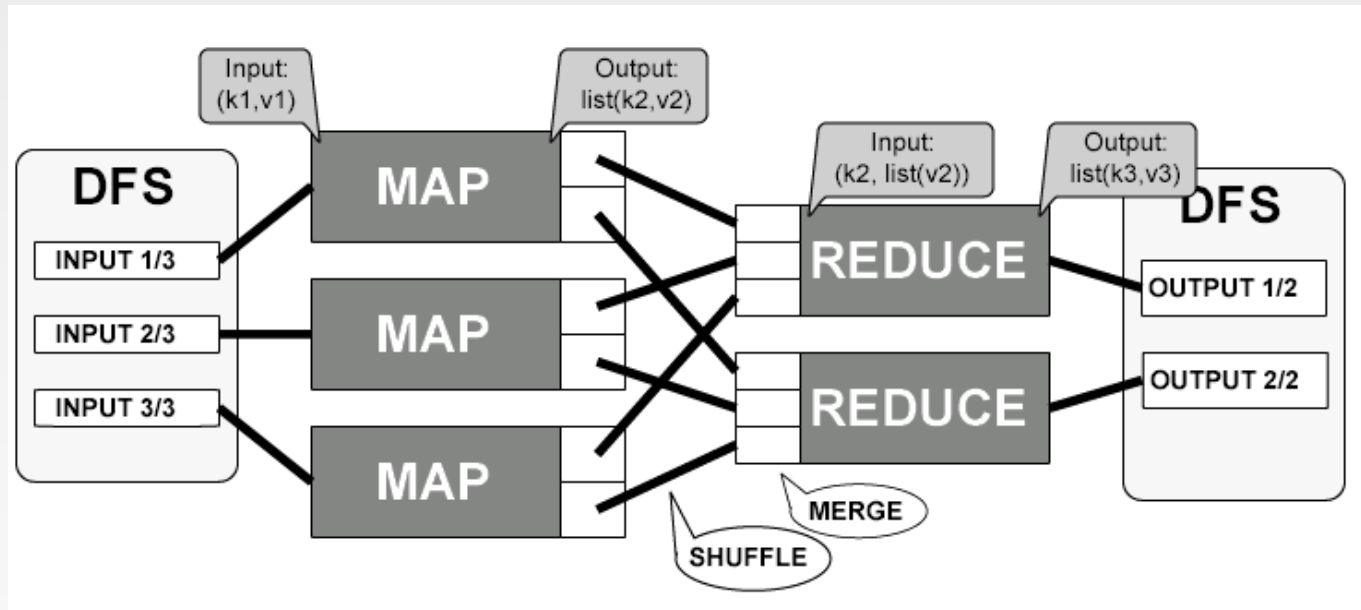
Step 2: Verification

Why Hadoop?

- Large amounts of data
- Data or processing does not fit in one machine
- Assumptions:
 - Self join: $R = S$
 - Two similar sets share at least 1 token
- Efficient Parallel Set-Similarity Joins Using Hadoop (SIGMOD'10)

A naïve solution

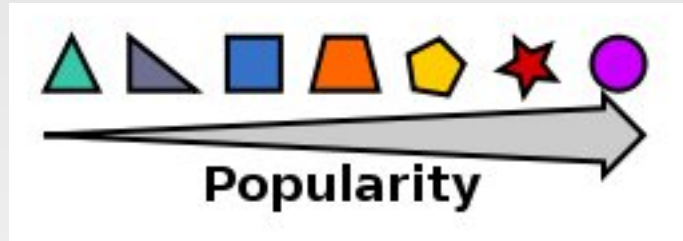
- Map: $\langle 23, (a,b,c) \rangle \rightarrow (a, 23), (b, 23), (c, 23)$
- Reduce: $(a,23), (a,29), (a,50), \dots \rightarrow$ Verify each pair $(23, 29), (23, 50), (29, 50) \dots$



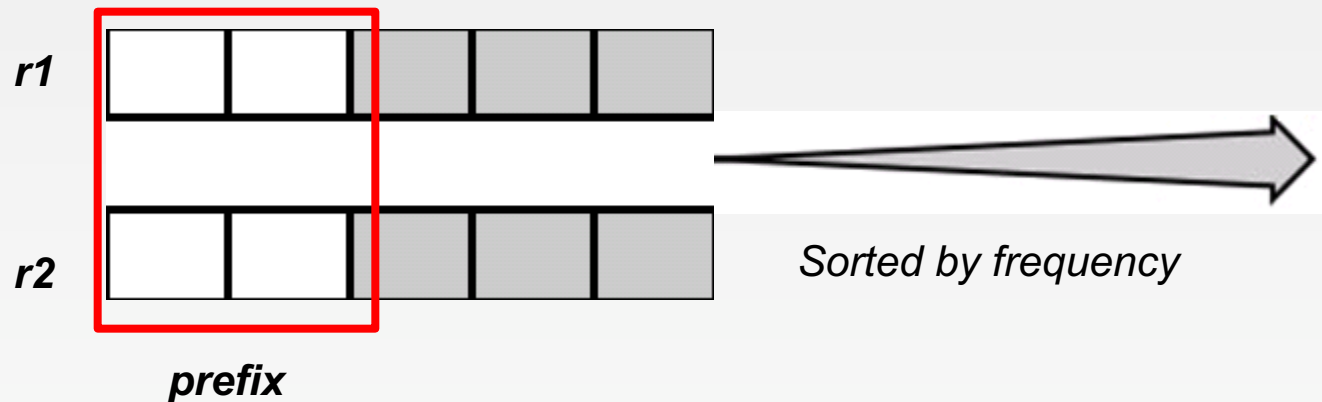
- Too much data to transfer ☹️
- Too many pairs to verify ☹️.

Solving frequency skew: prefix filtering

- Sort tokens by frequency (ascending)

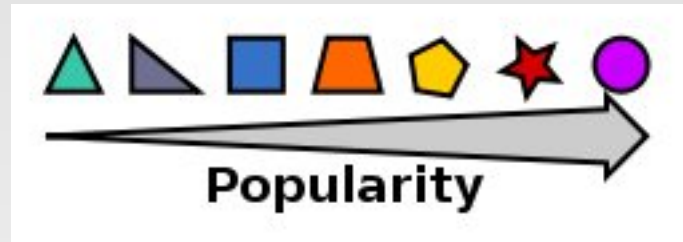


- Prefix** of a set: least frequent tokens



- Prefixes of similar sets should share tokens

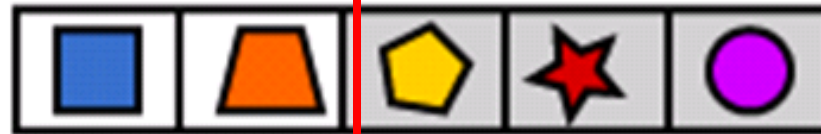
Prefix filtering: example



Record 1



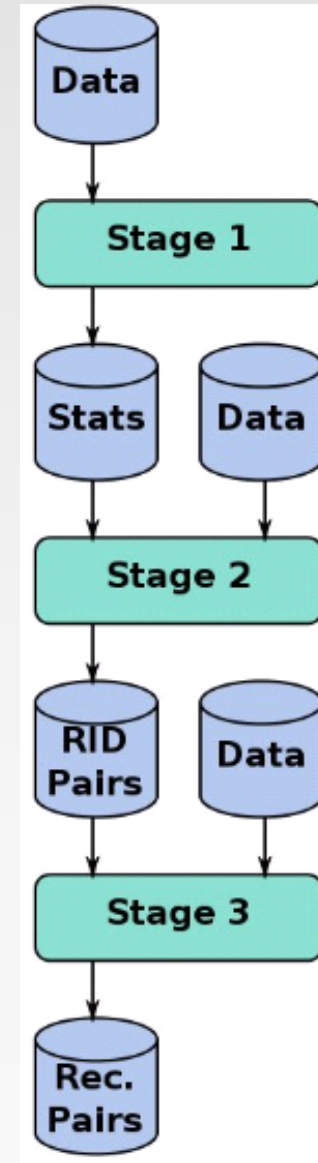
Record 2



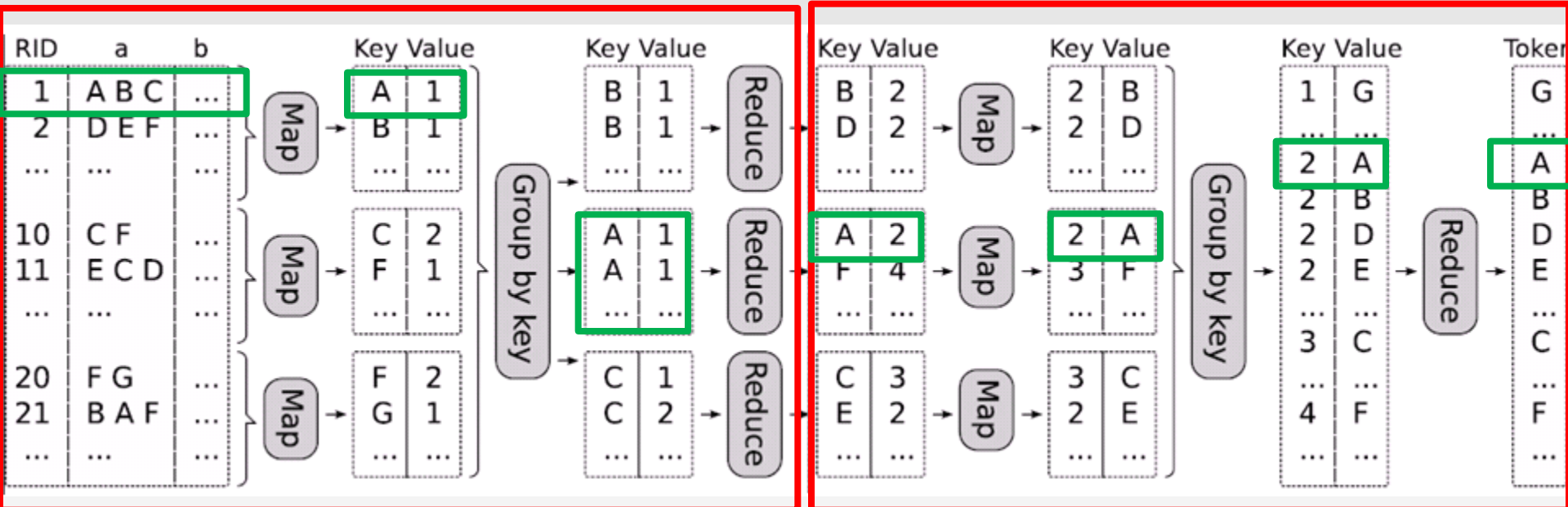
- Each set has 5 tokens
- “Similar”: they share at least 4 tokens
- Prefix length: 2

Hadoop Solution: Overview

- Stage 1: Order tokens by frequency
(Already done in the given example data)
- Stage 2: Finding “similar” id pairs
(verification)
- Stage 3: remove duplicates



Stage 1: Sort tokens by frequency



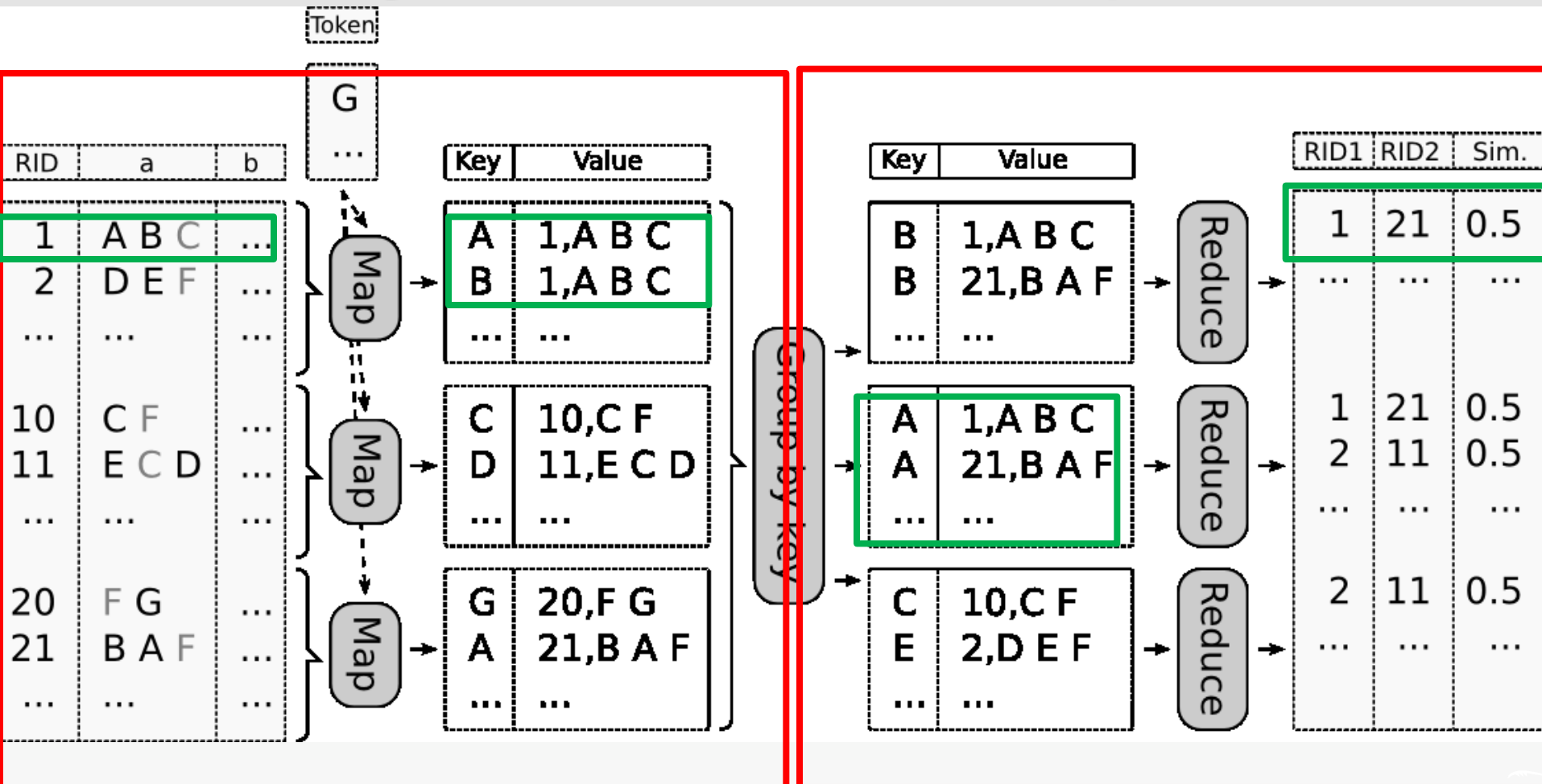
Compute token frequencies

Sort them

MapReduce phase 1

MapReduce phase 2

Stage 2: Find “similar” id pairs



Partition using prefixes

Verify similarity

Compute the Length of Shared Tokens

- Jaccard Similarity: $\text{sim}(r, s) = |r \cap s| / |r \cup s|$
- If $\text{sim}(r, s) \geq \tau$, $l = |r \cap s| \geq |r \cup s| * \tau \geq \max(|r|, |s|) * \tau$
- Given a record r , you can compute the prefix length as $p = |r| - l + 1$
- r and s is a candidate pair, they must share at least one token in the first $(|r| - l + 1)$ tokens
- Given a record $r = (A, B, C, D)$ and $p = 2$, the mapper emits (A, r) and (B, r)

Stage 3: Remove Duplicates

| RID1 | RID2 | Sim. |
|------|------|------|
| 1 | 21 | 0.5 |
| ... | ... | ... |
| 1 | 21 | 0.5 |
| 2 | 11 | 0.5 |
| ... | ... | ... |
| 2 | 11 | 0.5 |
| ... | ... | ... |

More Optimization Strategies

- It is your job!!!
- The faster the better