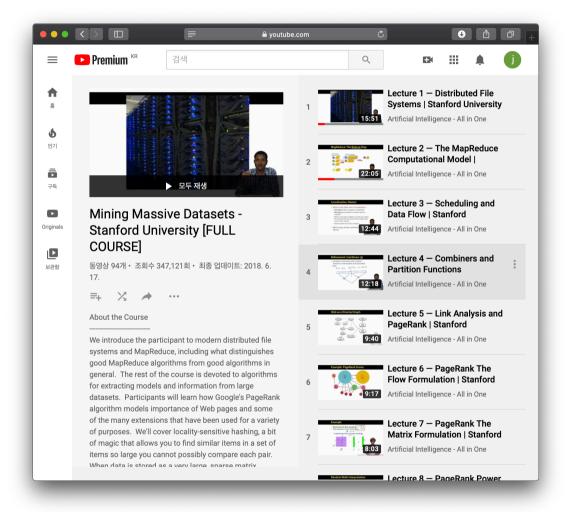
# **Mining Massive Datasets**

# Reference

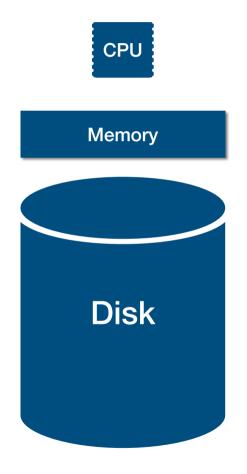
- Open Course : Mining Massive Datasets (Stanford)
- Textbook :
   Mining of Massive Datasets
   (Jure Leskovec, Anand Rajaraman, Jeff Ullman)



- 1. MapReduce
- 2. PageRank
- 3. Locality-Sensitive Hashing
- 4. Distance Measures, Nearest Neighbors
- 5. Frequent Itemsets
- 6. Communities in Social Networks
- 7. Stream Algorithms
- 8. Recommender Systems
- 9. Dimensionality Reduction
- 10.Clustering
- 11.Computational Advertising
- 12. Machine Learning
- 13.More About MapReduce
- 14. More About Locality-Sensitive Hashing
- 15. More About Link Analysis

**Physical Organization of Compute Nodes** 

Jisung Jeong / jisung0920.github.io



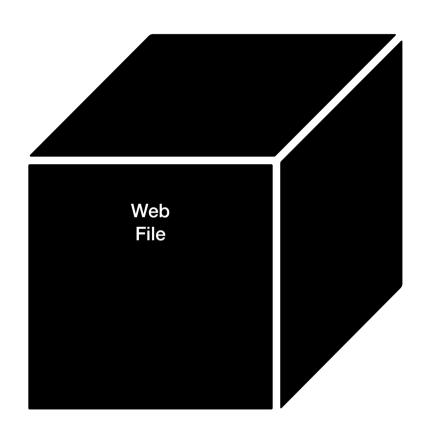


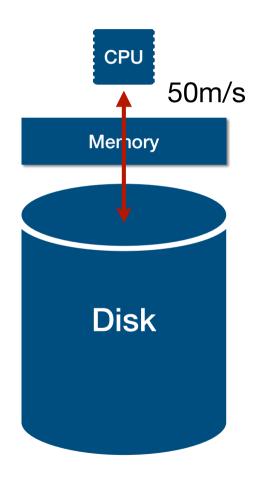
- 웹페이지 수 : 10Billion

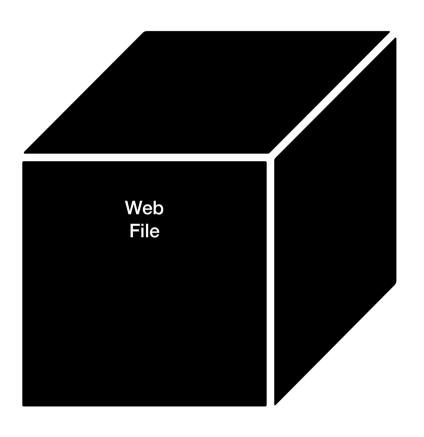
- 웹페이지 크기 : 20KB

= 200TB





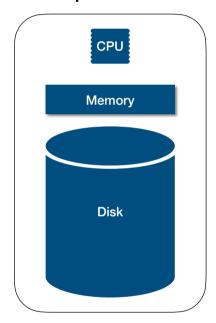


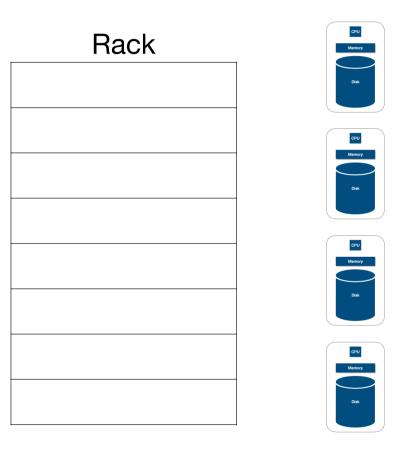


2. Distributed File Systems

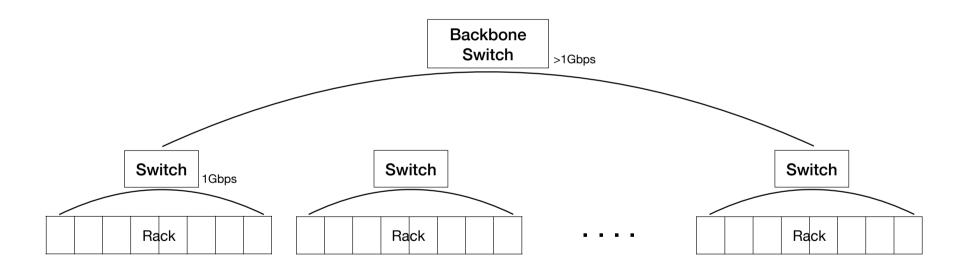
3. MapReduce

# Compute Node





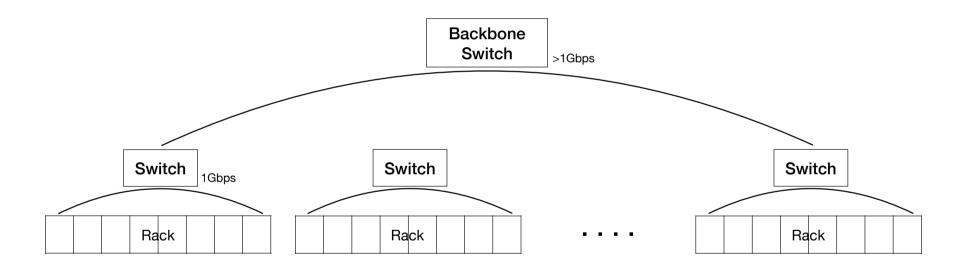






**Distributed File Systems** 

Jisung Jeong / jisung0920@gmail.com

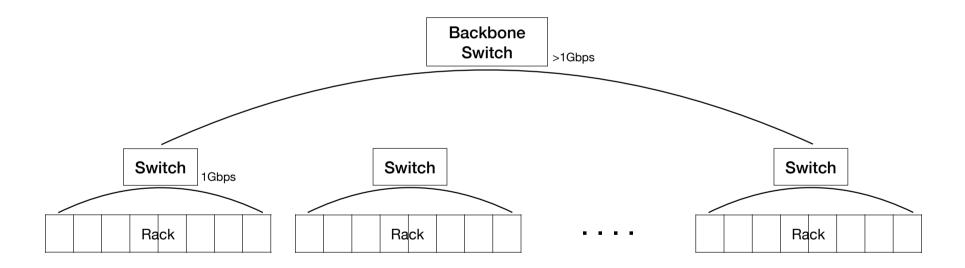


1. Node Failure

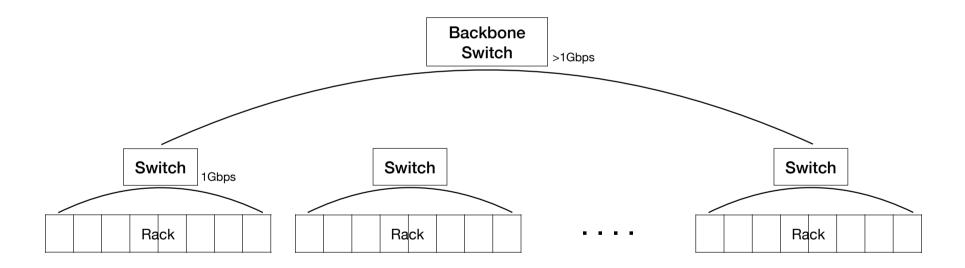
2. Network Bottleneck

3. Programming

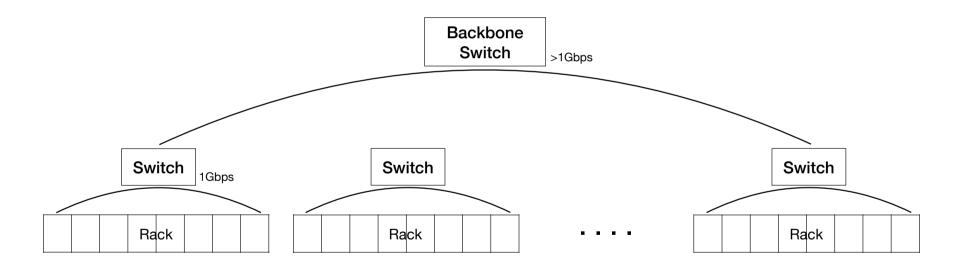
# Node Failure



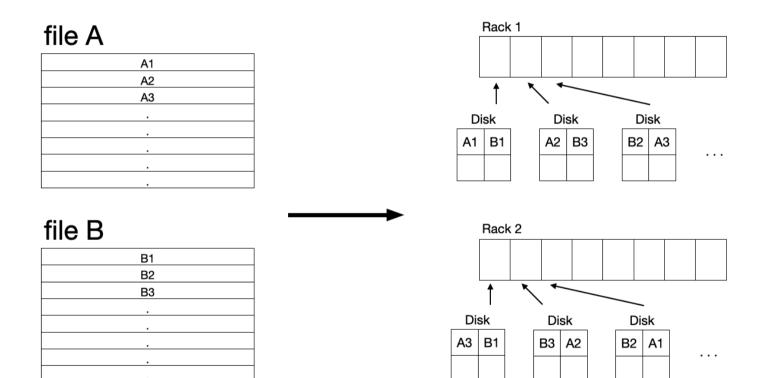
## Network Bottleneck



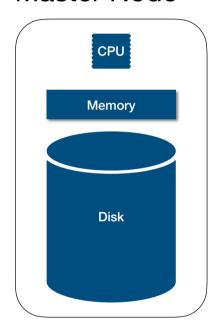
# Programming

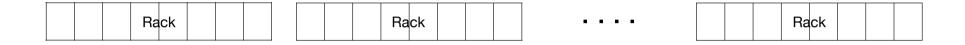


file A



# Master Node





Disk			_	Disk		Disk		Di	sk	
	АЗ	B1		ВЗ	A2		B2	A1		
	E1	U2		C2	Q9		V5	18		

**MapReduce** 

Jisung Jeong / jisung0920@gmail.com



Cluster

A1
A2
A3
.
.
.

B3 A2 C2 Q9 B2 A1 V5 18

A3 B1 E1 U2

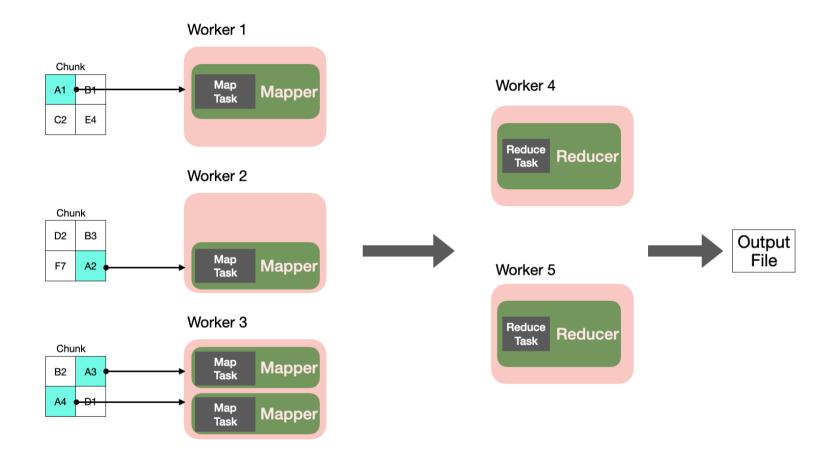
DFS

1. Map

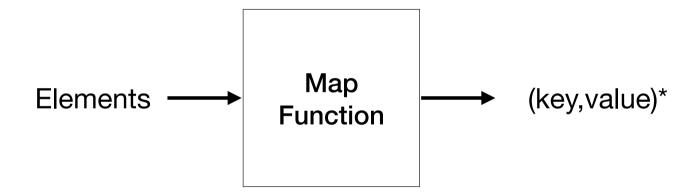
2. Group by Key

3. Reduce

- Worker
- Task
- Map Task
- Reduce Task
- Mapper
- Reducer



## Мар

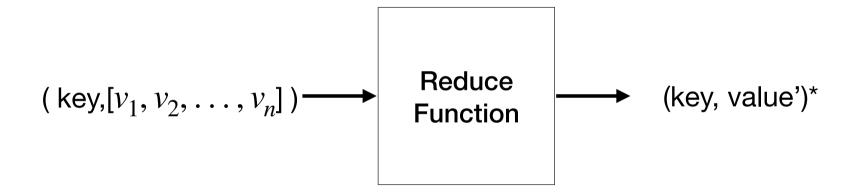


### Group by key

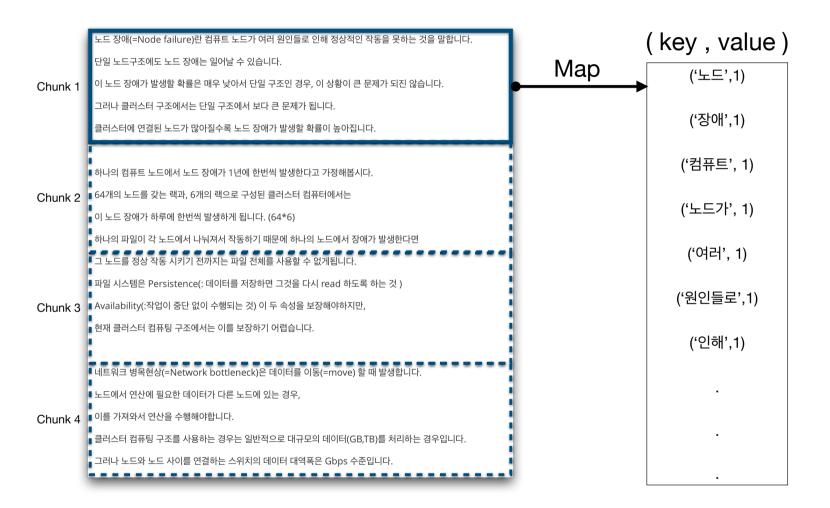
$$(k_1, v_a), (k_2, v_a), (k_3, v_b), (k_1, v_b), (k_1, v_c) \dots$$

$$(k_1, [v_a, v_b, v_c]), (k_2, [v_a]), \dots$$

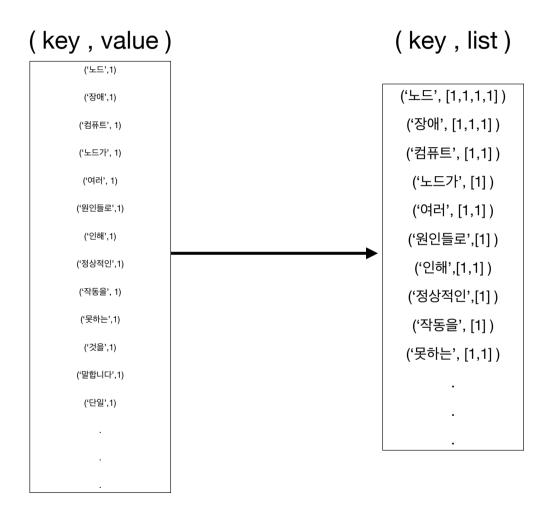
### Reduce



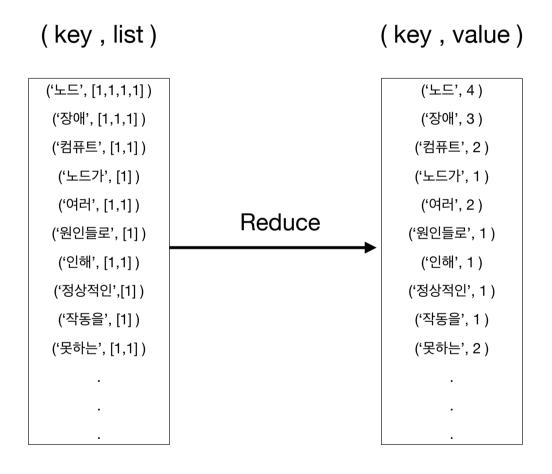
#### **Example - Word Counter**



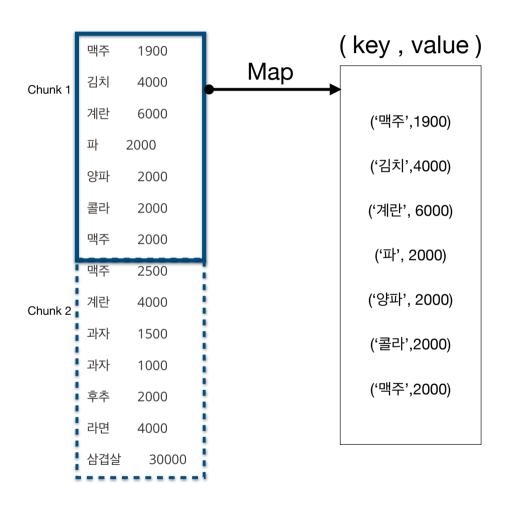
#### **Example - Word Counter**



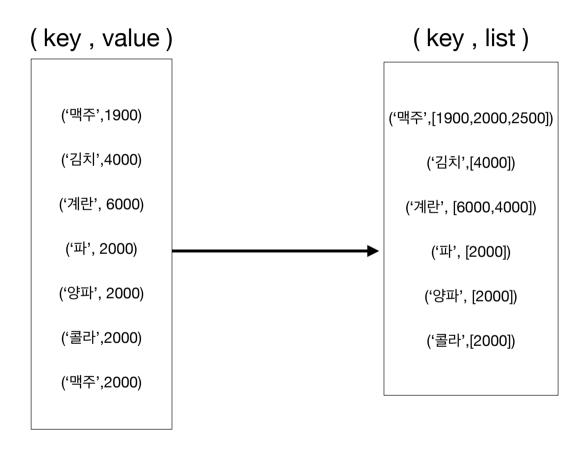
### **Example - Word Counter**



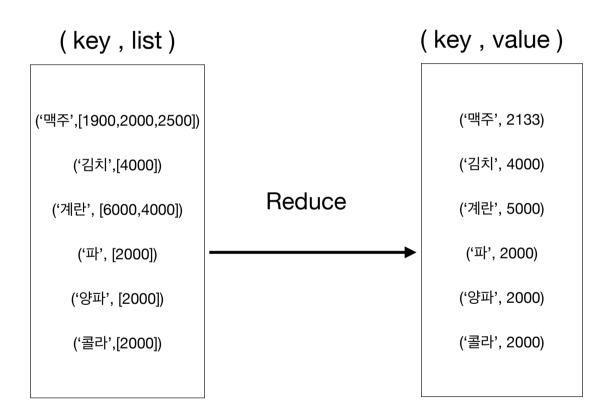
### **Example - Average Price**



### **Example - Average Price**



### **Example - Average Price**



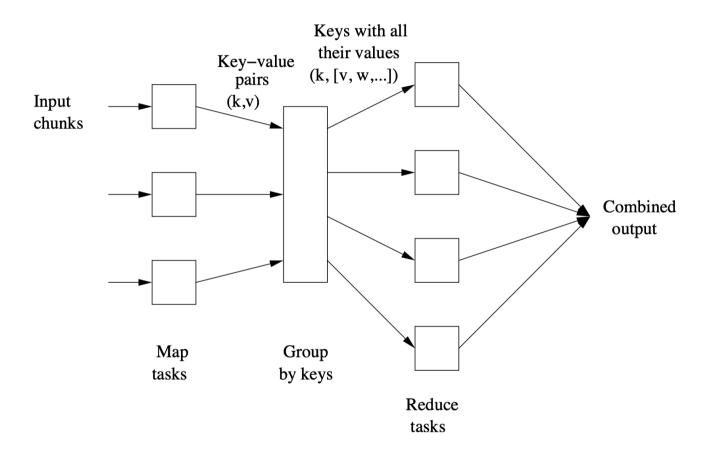


Figure 2.2: Schematic of a MapReduce computation

Mining of Massive Datasets - Figure 2.2

**Advanced** 

Jisung Jeong / jisung0920@gmail.com

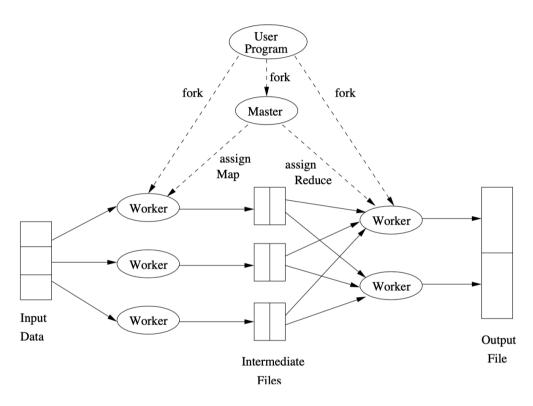


Figure 2.3: Overview of the execution of a MapReduce program

Mining of Massive Datasets - Figure 2.3

#### **Node Failure**

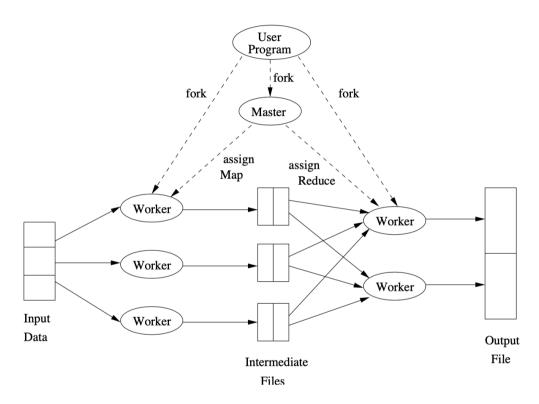


Figure 2.3: Overview of the execution of a MapReduce program

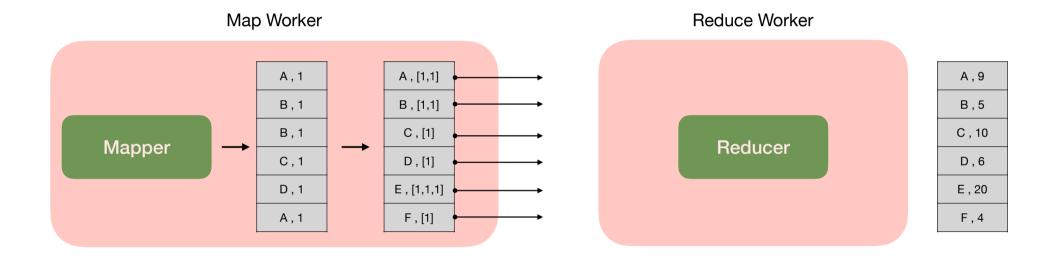
Mining of Massive Datasets - Figure 2.3

Master

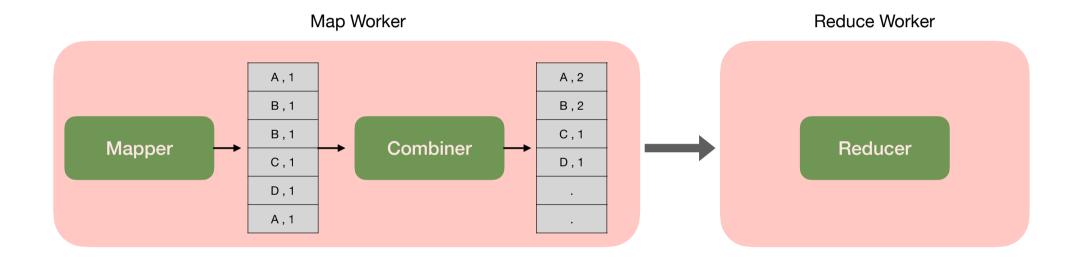
Map Worker

• Reduce Worker

## Combiner



## Combiner



#### **Partition Function**

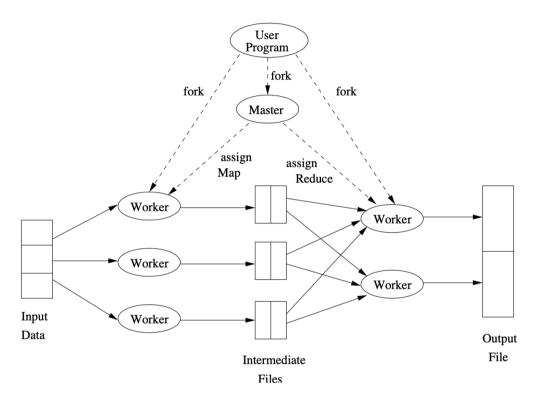


Figure 2.3: Overview of the execution of a MapReduce program

Mining of Massive Datasets - Figure 2.3

## **Partition Function**

