



CLOUD COMPUTING APPLICATIONS

MapReduce Example: Page Rank

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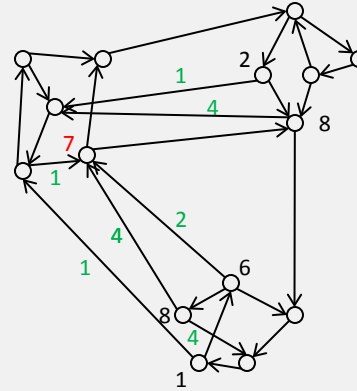
PageRank Algorithm

- Program implemented by Google to rank any type of recursive “documents” using MapReduce
- Initially developed at Stanford University by Google founders, Larry Page and Sergey Brin, in 1995
- Led to a functional prototype named Google in 1998
- PageRank value for a page u is dependent on the PageRank values for each page v out of the set B_u (all pages linking to page u), divided by the number $L(v)$ of links from page v

$$PR(u) = \sum_{v \in B_u} \frac{PR(v)}{L(v)}$$

PageRank

- Phase 1: Propagation
- Phase 2: Aggregation



- Input: A pool of objects, including both vertices and edges

PageRank: Propagation

- Map: for each object
 - If object is vertex, emit key=URL, value=object
 - If object is edge, emit key=source URL, value=object
- Reduce: (input is a web page and all the outgoing links)
 - Find the number of edge objects \rightarrow outgoing links
 - Read the PageRank value from the vertex object
 - Assign $PR(\text{edges}) = PR(\text{vertex}) / \text{num_outgoing}$

PageRank: Aggregation

- Map: for each object
 - If object is vertex, emit key=URL, value=object
 - If object is edge, emit key=destination URL, value=object
- Reduce: (input is a web page and all the incoming links)
 - Add the PR value of all incoming links
 - Assign $PR(\text{vertex}) = \sum PR(\text{incoming links})$