

# WikipediaSearch

An application of Personalized PageRank on a Wikipedia subset

Roberto Corti

Information Retrieval exam

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DATA SCIENCE &  
SCIENTIFIC COMPUTING

# Outline

Introduction

Wikipedia dataset

WikipediaSearch implementation

WikipediaSearch evaluation

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# WikipediaSearch

## *A brief introduction*

**WikipediaSearch** is a user-interactive tool that computes a Personalized (or Topic Specific) PageRank over a Wikipedia corpus.

# WikipediaSearch

## A brief introduction

[illegible]

**Input interface:** user specifies the topics in which he/she has more interest

# WikipediaSearch

## *A brief introduction*

### WikipediaSearch

#### Result for Roberto Corti

- [Mean\\_\(statistics\)](#)
- [Statistics](#)
- [Computer](#)
- [Mathematics](#)
- [Science](#)
- [Computer\\_science](#)
- [Message\\_\(computer\\_science\)](#)
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- [Sampling](#)
- [Number](#)
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- [People](#)
- [Programmer](#)

**Output page:** a rank of Wikipedia articles in which the user would be interested to read

# The problem

*"Bringing Order to the Web"*

Algorithm developed by L. Page and S. Brin (Google co-founders) used to determine the order of web pages

**Problem:** Is there a rating system that could measure the human interest and attention devoted to web pages?

# The problem

## *"Bringing Order to the Web"*

Algorithm developed by L. Page and S. Brin (Google co-founders) used to determine the order of web pages

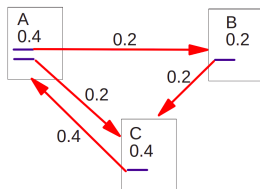
**Problem:** Is there a rating system that could measure the human interest and attention devoted to web pages?

**PageRank idea:** modeling the behavior of a "random surfer" in the Web graph.



# A recap of PageRank theory

*From L.Page and S.Brin (1998)*



$\vec{x}$  : probability distribution vector of the nodes

$M$  : square, stochastic matrix corresponding to the directed graph where  $M_{ij} = 1/N_j$

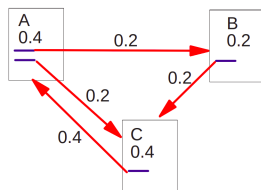
$\Rightarrow$  Find the stationary probability distribution  $\Leftrightarrow$  find the unique stochastic eigenvector of to the eigenvalue 1:

$$M\vec{\pi} = \vec{\pi}$$

$\vec{\pi}$  = PageRank vector

# A recap of PageRank theory

*From L.Page and S.Brin (1998)*



Power method solution:

- ▶ Start with  $\vec{x}_0 = \text{random}()$
- ▶  $\vec{x}_i = M\vec{x}_{i-1}$   
until  $|\vec{x}_i - \vec{x}_{i-1}| < \epsilon$

# A recap of PageRank theory

*From L.Page and S.Brin (1998)*

Two problems:

- ▶ **Dangling nodes**: pages without outgoing edges. How to assign probability to them?
- ▶ **Pages without incoming or outgoing links** : node without incoming edges or group of nodes without outgoing edges. For the first ones we have probability 0 of returning to it once we leave it, while for the others we can never leave them once entered

# A recap of PageRank theory

*From L.Page and S.Brin (1998)*

Allow the random surfer to move to a random page of the graph with probability  $\alpha$ .

The stochastic matrix will be:

$$\begin{aligned} M' &= (1 - \alpha)M + \alpha \left[ \frac{1}{N} \right]_{N \times N} \\ &= (1 - \alpha)M + \alpha \vec{1}^T \cdot \vec{J} \end{aligned}$$

where  $\vec{J} = (1/N, \dots, 1/N)$  is the *jump vector*

# A recap of Topic-Sensitive PageRank

*From Taher H. Haveliwala (2003)*

In addition to the PageRank calculation we can *specialize* the scores of the pages by limiting them to a single topic.

For a given topic-specific set of pages  $S$ , we allow the random surfer to teleport only to pages that are inside  $S$

# A recap of Topic-Sensitive PageRank

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For a given topic-specific set of pages  $S$ , we allow the random surfer to teleport only to pages that are inside  $S$

$$M' = (1 - \alpha)M + \alpha \vec{1}^T \cdot \vec{J}_S$$

where the *topic-specific jump vector* is defined as

$$J_{S_i} = \begin{cases} 1/|S|, & \text{if page } i \in S. \\ 0, & \text{otherwise.} \end{cases}$$

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# Wikipedia ...

content...



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# Standard PageRank

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