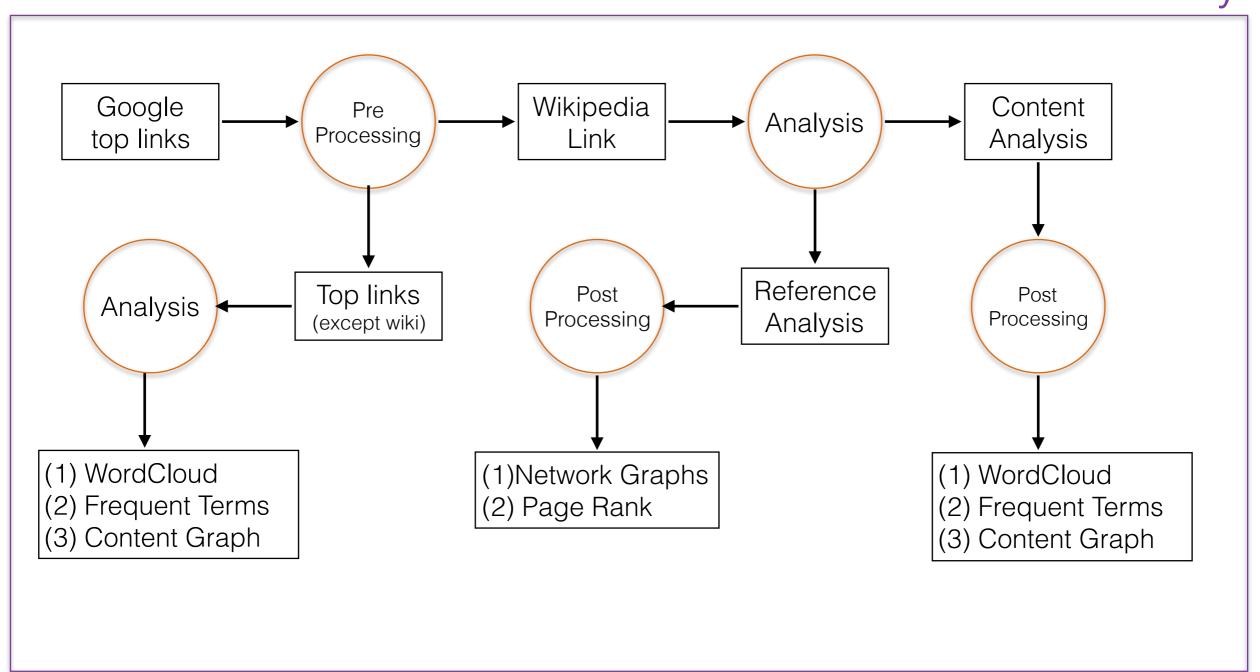
Page Rank and Content Analysis

Ravi K Rajendran Grad Student, Computer Science CS688 Web Analytics and Text Mining

Flow of the project

Shiny



Google Search results

Query-1: Microsoft

data

/url?q=https://www.microsoft.com/&sa=U&ved=0ahUKEwivvPTunYbRAhUI4oMKHWdDBlwQFggjMAA&usg=AFQjCNHRxMvFJHpKyV9IY0hlnEiQ72QKFg

/url?q=https://www.microsoft.com/en-

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/url?q=https://support.microsoft.com/en-us/help/17777/downloads-for-

windows&sa=U&ved=0ahUKEwivvPTunYbRAhUl4oMKHWdDBlwQjBAlLDAE&usg=AFQjCNErVk1cEviX-PDR0c3Fi0Od9UGewA

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us/surface&sa=U&ved=0ahUKEwivvPTunYbRAhUI4oMKHWdDBIwQjBAIMDAF&usg=AFQjCNEdQO5O6sGieU9993YxyAe3RkAwmg

Query-2: Apple

data

/url?q=http://www.apple.com/&sa=U&ved=0ahUKEwjk97nvnYbRAhXoz4MKHehFDMsQFgghMAA&usg=AFQjCNFf-ryUHIE9AY4RteHfcyP7KaHQYg

 $/url?q=https://support.apple.com/\&sa=U\&ved=0\\ahUKEwjk97nvnYbRAhXoz4MKHehFDMsQjBAlKDAB\&usg=AFQjCNFJd2wCgEOSMQKwLVAR9RV2OKBG5A$

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 $/url?q=http://www.apple.com/mac/\&sa=U\&ved=0\\ahUKEwjk97nvnYbRAhXoz4MKHehFDMsQjBAlLDAC\&usg=AFQjCNH_J82DTQR9KpsErLtZbSQ8wToTRQBAlLDAC&usg=AFQjCNH_J82DTQR9KpsErLtZbSQ8wToTRQBAlLDAC&usg=AFQjCNH_J82DTQR9KpsErLtZbSQ8wToTRQBAlLDAC&usg=AFQjCNH_J82DTQR9KpsErLtZbSQ8wToTRQBAlLDAC&usg=AFQjCNH_J82DTQR9KpsErLtZbSQ8wToTRQBAlLDAC&usg=AFQjCNH_J82DTQR9KpsErLtZbSQ8wToTRQBAlLDAC&usg=AFQjCNH_J82DTQR9KpsErLtZbSQ8wToTRQBAlLDAC&usg=AFQjCNH_J82DTQR9KpsErLtZbSQ8wToTRQBAlLDAC&usg=AFQjCNH_J82DTQR9KpsErLtZbSQ8wToTRQBAlLDAC&usg=AFQjCNH_J82DTQR9KpsErLtZbSQ8wToTRQBAlLDAC&usg=AFQjCNH_J82DTQR9KpsErLtZbSQ8wToTRQBAlLDAC&usg=AFQjCNH_J82DTQR9KpsErLtZbSQ8wToTRQBAllDAC&usg=AFQjCNH_J82DTQR9WToTRQBAllDAC&usg=AFQjCNH_J82DTQR9WToTRQBAllDAC&usg=AFQjCNH_J82DTQR9WToTRQBAllDAC&usg=AFQjCNH_J82DTQR9WToTRQBAllDAC&usg=AFQjCNH_J82DTQR9WToTRQBAllDAC&usg=AFQjCNH_J82DTQR9WToTRQBALlDAC&usg=AFQ$

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Google Search results

Query-1: Microsoft

data

https://www.microsoft.com/en-us/download
https://support.microsoft.com/en-us/help/17777/downloads-for-windows
https://support.microsoft.com/en-us
https://support.microsoft.com/en-us

Query-2: Apple

data

http://www.apple.com/
https://support.apple.com/
http://www.apple.com/iphone/
http://www.apple.com/mac/
http://www.apple.com/retail/

Wiki - References:

Query1

/wiki/Wikipedia:Protection_policy#semi

/wiki/File:Microsoft_logo_(2012).svg

/wiki/File:Microsoft_building_17_front_door.jpg

/wiki/Microsoft_Redmond_campus

/wiki/Redmond,_Washington

/wiki/Types_of_business_entity

/wiki/Public_company

/wiki/Ticker_symbol

/wiki/NASDAQ

/wiki/NASDAQ-100

/wiki/Dow_Jones_Industrial_Average

/wiki/S%26P_100

/wiki/S%26P_500

/wiki/Software

/wiki/Computer_hardware

Query1

Wikipedia Protection policy semi

File Microsoft logo 2012 svg

File Microsoft building 17 front door jpg

Microsoft Redmond campus

Redmond, Washington

Types of business entity

Public company

Ticker symbol

NASDAQ

NASDAQ 100

Dow Jones Industrial Average

S 26P 100

S 26P 500

Software

Computer hardware

Wiki - References:

Que	ry2
/wiki	/Wikipedia:Protection_policy#semi
/wiki	/Apple
/wiki	/Apple_(disambiguation)
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/wiki	/Apple_Campus
/wiki	/Infinite_Loop_(street)
/wiki	/Cupertino,_California
/wiki	/Types_of_business_entity
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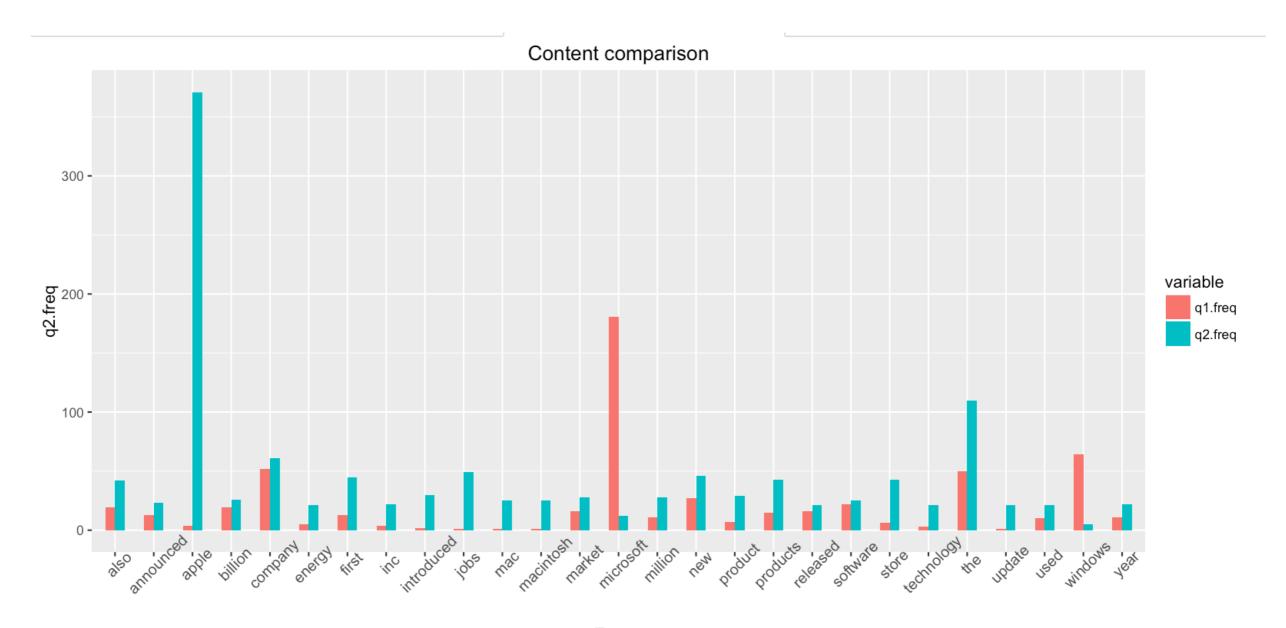
Query2
Wikipedia Protection policy semi
Apple
Apple disambiguation
Geographic coordinate system
File Apple logo black svg
File Apple Headquarters in Cupertino jpg
Apple Campus
Infinite Loop street
Cupertino, California
Types of business entity
Public company
Ticker symbol
NASDAQ
NASDAQ 100
Dow Jones Industrial Average

Common Wikipedia Link References:

ZDNet		
International Standard Serial Number Joshua Topolsky		
		Engadget
AOL		
Wikipedia Wikimedia sister projects		
OpenCorporates		
Apple Computer, Inc v Microsoft Corp		
mplate Major information technology companies		
Template talk Major information technology companies		
Information technology		
ist of the largest information technology companies		
List of largest Internet companies		
Semiconductor sales leaders by year		
Atos		
Booz Allen Hamilton		
BMC Software		
BT Global Services		
BT Global Services CACI		

Results:

Common contents

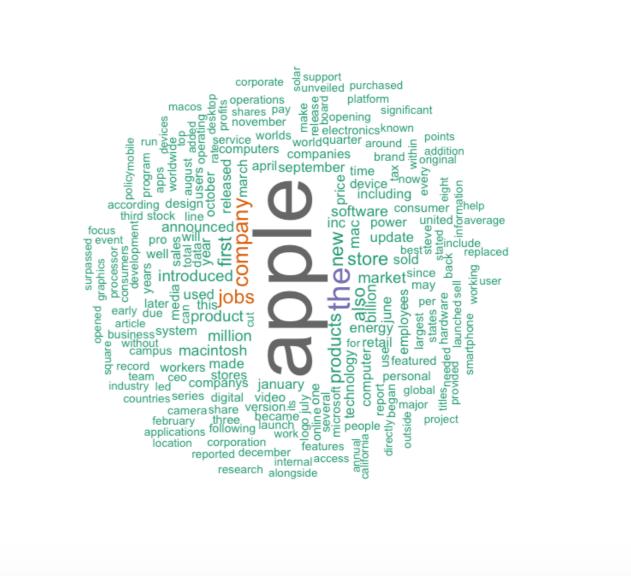


Results:

Query-1: Microsoft

strategy united security states came acquired un

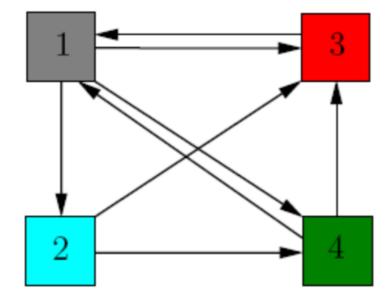
Query-2: Apple



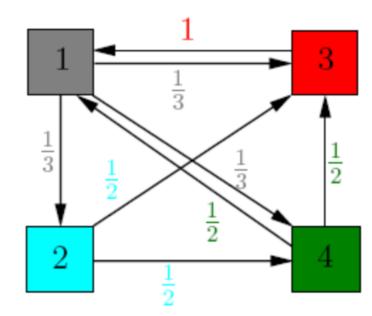
Page Ranking

Pages: 1 - 4

Page Links



Weighted



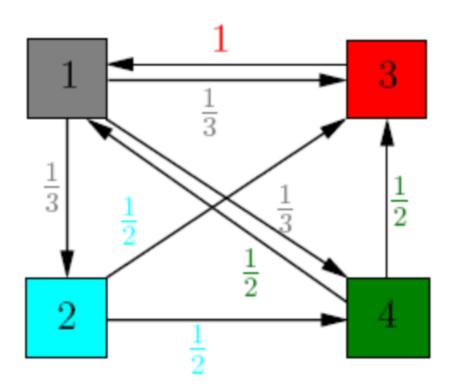
Reference: http://www.math.cornell.edu/~mec/Winter2009/RalucaRemus/Lecture3/lecture3.html

Page Ranking

Pages: 1 - 4

Weighted

Transition Matrix

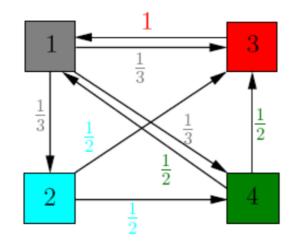


$$A = \begin{bmatrix} 0 & 0 & 1 & \frac{1}{2} \\ \frac{1}{3} & 0 & 0 & 0 \\ \frac{1}{3} & \frac{1}{2} & 0 & \frac{1}{2} \\ \frac{1}{3} & \frac{1}{2} & 0 & 0 \end{bmatrix}$$

Page Ranking

Page Vector

Weighted



Transition Matrix

$$A = \begin{bmatrix} 0 & 0 & 1 & \frac{1}{2} \\ \frac{1}{3} & 0 & 0 & 0 \\ \frac{1}{3} & \frac{1}{2} & 0 & \frac{1}{2} \\ \frac{1}{3} & \frac{1}{2} & 0 & 0 \end{bmatrix}.$$

Page rank Calculation

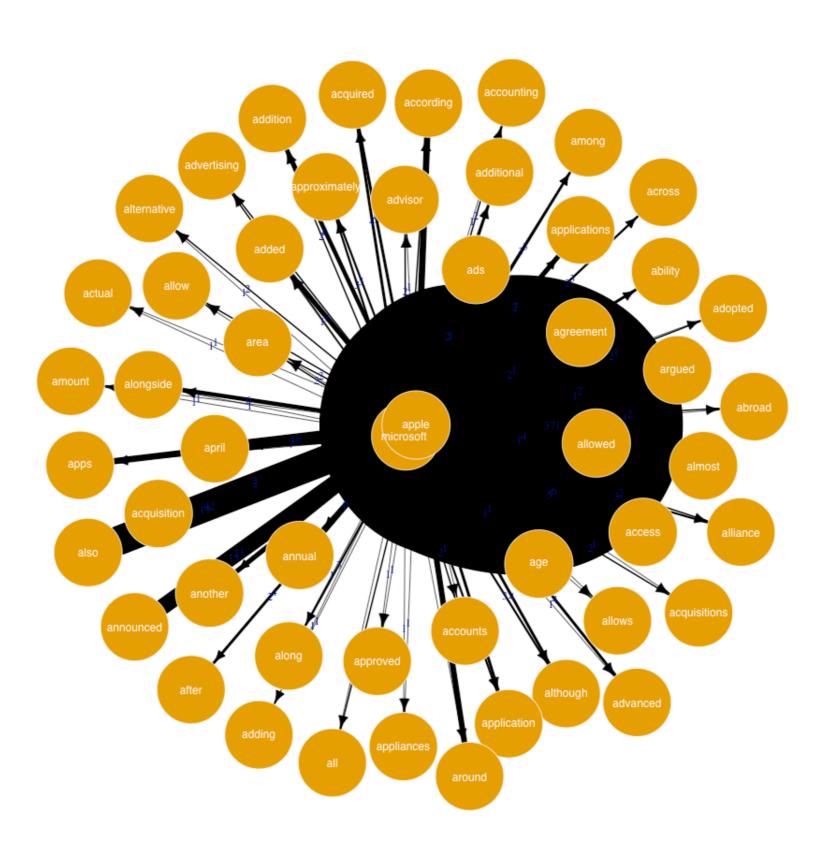
$$\mathbf{v} = \begin{pmatrix} 0.25 \\ 0.25 \\ 0.25 \\ 0.25 \end{pmatrix}, \quad \mathbf{A}\mathbf{v} = \begin{pmatrix} 0.37 \\ 0.08 \\ 0.33 \\ 0.20 \end{pmatrix}, \quad \mathbf{A}^2 \mathbf{v} = \mathbf{A} \ (\mathbf{A}\mathbf{v}) = \mathbf{A} \begin{pmatrix} 0.37 \\ 0.08 \\ 0.33 \\ 0.20 \end{pmatrix} = \begin{pmatrix} 0.43 \\ 0.12 \\ 0.27 \\ 0.16 \end{pmatrix}$$

$$\mathbf{A}^3 \mathbf{v} = \begin{pmatrix} 0.35 \\ 0.14 \\ 0.29 \\ 0.20 \end{pmatrix}, \quad \mathbf{A}^4 \mathbf{v} = \begin{pmatrix} 0.39 \\ 0.11 \\ 0.29 \\ 0.19 \end{pmatrix}, \quad \mathbf{A}^5 \mathbf{v} = \begin{pmatrix} 0.39 \\ 0.13 \\ 0.28 \\ 0.19 \end{pmatrix}$$

$$\mathbf{A}^6 \mathbf{v} = \begin{pmatrix} 0.38 \\ 0.13 \\ 0.29 \\ 0.19 \end{pmatrix}, \quad \mathbf{A}^7 \mathbf{v} = \begin{pmatrix} 0.38 \\ 0.12 \\ 0.29 \\ 0.19 \end{pmatrix}, \quad \mathbf{A}^8 \mathbf{v} = \begin{pmatrix} 0.38 \\ 0.12 \\ 0.29 \\ 0.19 \end{pmatrix}$$

Reference: http://www.math.cornell.edu/~mec/Winter2009/RalucaRemus/Lecture3/lecture3.html

Network Graph



Thank you