Lab 7 - Page Rank

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Implementation Overview:

We decided to go with an adjacency list to store the data. We used a hash table to represent the adjacency list with key having a list of outgoing nodes. We utilized a recursive definition of the following page rank algorithm.

$$pageRank(i) = (1 - d) \cdot \frac{1}{|V|} + d \cdot \sum_{k=1}^{s} \frac{1}{|O_{j_k}|} \cdot pageRank(j_k).$$

To keep from infinitely recursing we kept track of how many links it would follow. After experimentation we found that limiting it to 100 was a good choice.

Results

State Borders

A) We ran it with pageRank stateborders.csv

27 "MA" 0.004684474724980301

B) Output

```
1 "ME" 0.008871292491901554
                                      28 "NY" 0.004684474724980301
2 "NH" 0.00623729438837153
                                      29 "UT" 0.004649937672368798
3 "RI" 0.00591706916539193
                                      30 "NV" 0.004649937672368798
4 "FL" 0.0058882356745345804
                                      31 "OH" 0.004630351989503551
5 "DC" 0.005697061561219844
                                      32 "WV" 0.004606379627553485
6 "SC" 0.005684715410389589
                                      33 "TX" 0.0045922595823087746
7 "WA" 0.005663497393283831
                                      34 "KS" 0.004572393928634246
8 "MV" 0.0055976997908010065
                                      35 "PA" 0.0045686586878720525
9 "DE" 0.00527457227770489
                                      36 "MD" 0.0045686586878720525
10 "NJ" 0.00527457227770489
                                      37 "IL" 0.004567244834338163
11 "CA" 0.0051747327219218535
                                      38 "AR" 0.004542431408901367
12 "MI" 0.005142089917146441
                                      39 "GA" 0.00453790862353767
                                      40 "ID" 0.004485061756524572
13 "ND" 0.005132387072717734
14 "VT" 0.005116622832758942
                                      41 "OK" 0.004470673834930514
15 "CT" 0.005116622832758942
                                      42 "NB" 0.004454119123535074
16 "LA" 0.005078602571821814
                                      43 "NE" 0.004454119123535074
17 "AL" 0.005044808409702031
                                      44 "VA" 0.004441063328959812
18 "OR" 0.004901572691965027
                                      45 "CO" 0.0044187349352119015
19 "AZ" 0.004901572691965027
                                      46 "IA" 0.004386673326892578
20 "MS" 0.004875490386286898
                                      47 "WY" 0.004369637119892808
21 "NM" 0.004846735815951193
                                      48 "TN" 0.004369117742163056
22 "IN" 0.004779619498532601
                                      49 "SD" 0.004365959195395606
23 "WI" 0.004779619498532601
                                      50 "KY" 0.004321182298285908
24 "NC" 0.004773730254214402
                                      51 "MO" 0.004268030922633414
25 "MT" 0.004763121245661523
26 "MN" 0.0047433697684129
```

C) We do not believe that this is accurate because ME is only directly visited by one other page, yet it is #1 in our list.

NCAA Football

- A) We ran it with pageRank NCAA football.csv flag
- B) Output
- 1 "Northern Colorado" 0.001966862269974513
- 2 "Wesley College" 0.0017416061762123222
- 3 "North Texas" 0.0016645446042382543
- 4 "Stonehill" 0.001647656898999498
- 5 "Henderson State" 0.0016080555449166831
- 6 "Arkansas-Monticello" 0.0016080555449166831
- 7 "St. Francis (IL)" 0.0015897623269108393
- 8 "Marian" 0.0015897623269108393
- 9 "Fayetteville State" 0.001562503566298497
- 10 "Southern Methodist" 0.0015459961554299992
- 11 "Howard" 0.001539859026374712
- 12 "Edward Waters" 0.001539859026374712
- 13 "Washburn" 0.0015394624806800384
- 14 "Tuskegee" 0.001522131845513619
- 15 "Franklin" 0.0014947700613687303
- 16 "Idaho State" 0.0014910722540155833
- 17 "Rhodes" 0.001469906232567846
- 18 "Georgetown" 0.0013877846490894467
- 19 "Birmingham Southern" 0.0013874648437499997
- 20 "Methodist" 0.0013874648437499997
- 21 "Idaho" 0.0013681967599872566
- 22 "San Diego State" 0.0013188622491348834
- 23 "Iona" 0.0012105540799655322
- 24 "Alcorn State" 0.0011887933974583415
- 25 "Winston-Salem" 0.0011817001827262978
- 26 "Austin Peay" 0.0011815917087521209
- 27 "Purdue" 0.0011643788506973834
- 28 "Washington State" 0.00115660750254888
- 29 "Tulane" 0.0011540403316496793
- 30 "Columbia" 0.001153438337145135
- 31 "North Carolina Pembroke" 0.0011474219408359394
- 32 "Northeastern" 0.0011406624930343499
- 33 "Utah State" 0.0011357519160899222
- 34 "Miami (OH)" 0.0011226810448223374
- 35 "Iowa State" 0.0011225182601964944
- 36 "Western Kentucky" 0.0011145869915793953
- 37 "Wagner" 0.0010935562254041071
- 38 "North Carolina A&T" 0.001085832998909739

C) This one is not accurate since Chattanooga is listed as last and Northern Colorado is listed first but both appear in the losing brackets.

Karate

- A) We ran it with pageRank karate.csv
- B) Output
 - 1 12 0.010702278277374936 2 27 0.008686816781654156 3 17 0.00861311250562092 4 10 0.008317518531660132 5 19 0.008289313458214178 6 16 0.008289313458214178 7 15 0.008289313458214178 8 23 0.008289313458214178 9 21 0.008289313458214178 10 18 0.00824819796221688 11 13 0.00824819796221688 12 22 0.00824819796221688 13 25 0.007848441714411538 14 26 0.007674934249138413 15 29 0.007476384903459695 16 11 0.007430171190497527 17 5 0.007430171190497527
- 18 20 0.007430171190497527 19 30 0.007204730098618516 20 31 0.0070667660143209875 21 28 0.007055818089359477 22 24 0.007026712087470451 23 8 0.00702115780463785 24 7 0.00702115780463785 25 6 0.00702115780463785 26 14 0.006775749773122045 27 9 0.006775749773122045 28 32 0.006612144418778174 29 4 0.006612144418778174 30 2 0.006339468828205057 31 3 0.006284933710090434 32 33 0.0062146844611590405 33 34 0.006114172180459822 34 1 0.006112279738874364

Dolphins

- A) We ran it with pageRank dolphins.csv
- B) Output

```
1 "Zig" 0.006508118092486805
2 "Fork" 0.006123752146561403
3 "Five" 0.006123752146561403
4 "Cross" 0.006123752146561403
5 "TR82" 0.006008678259434428
6 "Whitetip"
0.006004848671276325
7 "SMN5" 0.005998898451769422
8 "MN23" 0.0059816484990582
9 "Quasi" 0.0059816484990582
10 "Wave" 0.00474536484919868
11 "TR88" 0.004673922485408157
12 "Vau" 0.004622728745368304
13 "SN89" 0.004615642698703314
14 "TSN83" 0.004610845554093384
15 "TR120" 0.004610845554093384
```

16 "Zipfel" 0.004230417118396959

17 "CCL" 0.004177560180046976 18 "Ripplefluke" 0.0041478191004334945 19 "MN60" 0.004136234917415112 20 "Notch" 0.004121733435600881 21 "Mus" 0.004112162402911873 22 "Thumper" 0.003967167677507396 23 "Bumper" 0.003933989154015877 24 "DN16" 0.0039052191640347985 25 "Knit" 0.003885654915410338 26 "TSN103" 0.0038647458168614536 27 "Zap" 0.0038483355197542536 28 "DN63" 0.0038014555342536093 29 "PL" 0.0037879331136398387 30 "Fish" 0.0037687163097243747

C) Although Zig shows up twice and the last one Grin shows up multiple times, Grin is last and Zig is first.

Lesmis

- A) We ran it with pageRank lesmis.csv
- B) Output

```
1 "Jondrette"
                                      11 "MlleVaubois"
0.006807704788284647
                                      0.0048777035267345715
2 "MmeBurgon"
                                      12 "MotherPlutarch"
0.005291735030937844
                                      0.004769998827022276
3 "Gribier" 0.005042185694701694
                                      13 "Boulatruelle"
4 "Champtercier"
                                      0.004723946971042979
                                      14 "MmeDeR" 0.004696999789233911
0.004930813416711781
5 "Count" 0.004930813416711781
                                      15 "Isabeau"
6 "Cravatte"
                                      0.004696999789233911
0.004930813416711781
                                      16 "Scaufflaire"
7 "Geborand"
                                      0.004696999789233911
0.004930813416711781
                                      17 "Labarre"
8 "OldMan" 0.004930813416711781
                                      0.004696999789233911
9 "CountessDeLo"
                                      18 "Gervais"
0.004930813416711781
                                      0.004696999789233911
                                      19 "MotherInnocent"
10 "Napoleon"
0.004930813416711781
                                      0.003800313626571626
```

C) Jondrette shows up only twice, while Valjean shows up many times. But Jondrette is first and Valjean is last.

Polblogs

- A) We ran it with pageRank polblogs.csv flag
- B) Output

```
1 325 9.389671361502346E-4
                                   16 364 3.8780240233694677E-4
2 1159 9.389671361502346E-4
                                   17 820 3.8259492711944967E-4
                                   18 382 3.777234038523594E-4
3 1293 9.389671361502346E-4
4 1260 9.389671361502346E-4
                                   19 1455 3.760304591254712E-4
5 1259 9.389671361502346E-4
                                   20 908 3.744139339696812E-4
6 821 4.922002522985143E-4
                                   21 766 3.734741784037558E-4
7 1291 4.8692898449934964E-4
                                   22 208 3.6426616381977667E-4
8 757 4.6026125680554016E-4
                                   23 1340 3.6416096139231676E-4
9 400 4.555015081928903E-4
                                   24 926 3.6416096139231676E-4
10 380 4.2482245735866596E-4
                                   25 1405 3.6416096139231676E-4
11 1490 4.054552269379823E-4
                                   26 1279 3.6416096139231676E-4
12 33 3.961316468289802E-4
                                   27 1247 3.6416096139231676E-4
13 424 3.955813637773306E-4
                                   28 230 3.6416096139231676E-4
14 858 3.9361738831360726E-4
                                   29 216 3.6416096139231676E-4
15 235 3.8780240233694677E-4
                                   30 833 3.6416096139231676E-4
```

Overall Summary

The idea of a good page rank would be one that had a lot of links pointing to and from the page. For our algorithm however, it did not produce good rankings for the data sets since some data only showed up twice, yet they were the top ranked. We know that the probability of a page to be visited is increased when there are more links to it. It worked better with undirected graphs versus directed ones.

Appendix

README