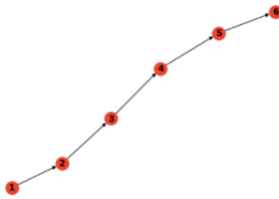


# Datamining HW3 Report

## Graph\_1:



### ● HITS

No node points to Node 1 so in this graph we can predict that Node 1 has lowest authority. Also from the graph we can tell Node 6 has 0 hub.

```
Authority: [('2', 0.447213595499958), ('3', 0.447213595499958), ('4', 0.447213595499958), ('5', 0.447213595499958), ('6', 0.447213595499958), ('1', 0.0)]
Hub: [('1', 0.447213595499958), ('2', 0.447213595499958), ('3', 0.447213595499958), ('4', 0.447213595499958), ('5', 0.447213595499958), ('6', 0.0)]
```

### ● Increase hub, authority:

To have a good authority Node 1 needs to have many nodes to point to it. To increase hub Node 1 needs to point to other nodes more than 1 time. Therefore, I add some links “from” Node 1 and “to” Node 1.

```
G.add_edge(('1','3'))
G.add_edge(('1','4'))
G.add_edge(('2','1'))
G.add_edge(('5','1'))
```

```
Authority: [('3', 0.6454972243598217), ('4', 0.5163955417074917), ('1', 0.38730195542058443), ('2', 0.38729695159156763), ('6', 0.12910168265233032), ('5', 2.457071591368814e-16)]
Hub: [('1', 0.7745948588327908), ('2', 0.5163995898924365), ('5', 0.25820181903757417), ('3', 0.25819777085486256), ('4', 1.2285357956897206e-16), ('6', 0.0)]
```

### ● PageRank

Different from authority and hub, pagerank consider the history status even if only Node 5 points to it however, Node 5 is pointed by Node4, Node 3, Node 2 and Node 1.

```
The page rank is
[('6', 0.10380841406249998), ('5', 0.09271578124999999), ('4', 0.07966562499999999), ('3', 0.0643125), ('2', 0.04625), ('1', 0.024999999999999998)]
```

### ● SimRank

The first number means the Node number. And then shows the pair-wise similarity of nodes.  $S(1,1) = 1$ ,  $S(1,2) = 0.0$ ,  $S(1,3) = 0.0$

```
1 {'1': 1, '2': 0.0, '3': 0.0, '4': 0.0, '5': 0.0, '6': 0.0}
2 {'2': 1, '1': 0.0, '3': 0.0, '4': 0.0, '5': 0.0, '6': 0.0}
3 {'3': 1, '1': 0.0, '2': 0.0, '4': 0.0, '5': 0.0, '6': 0.0}
4 {'4': 1, '1': 0.0, '2': 0.0, '3': 0.0, '5': 0.0, '6': 0.0}
5 {'5': 1, '1': 0.0, '2': 0.0, '3': 0.0, '4': 0.0, '6': 0.0}
6 {'6': 1, '1': 0.0, '2': 0.0, '3': 0.0, '4': 0.0, '5': 0.0}
```

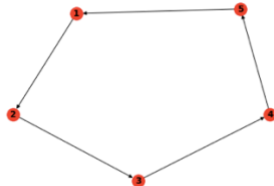
### ● Increase PageRank

To increase PageRank of Node 1 I let Node 1 become the last connected node. I deleted the link from Node 1 to Node 2 and added a link between Node 6 and Node 1.

```
G.add_edge(('6','1'))
G.del_edge(('1','2'))
```

```
The page rank is
[('1', 0.10380841406249998), ('6', 0.09271578124999999), ('5', 0.07966562499999999), ('4', 0.0643125),
('3', 0.04625), ('2', 0.024999999999999998)]
```

## Graph\_2:



### ● HITS

```
Authority: [('1', 0.447213595499958), ('2', 0.447213595499958), ('3',
0.447213595499958), ('4', 0.447213595499958), ('5', 0.447213595499958)]
Hub: [('1', 0.447213595499958), ('2', 0.447213595499958), ('3', 0.447213595499958),
('4', 0.447213595499958), ('5', 0.447213595499958)]
```

### ● Increase hub, authority:

After adding the links “from” and “to” Node 1 we can see there are some different between old hub/authority and new hub/authority.

```
G.add_edge(('1','3'))
G.add_edge(('1','4'))
G.add_edge(('2','1'))
G.add_edge(('3','1'))
```

```
Authority: [('1', 0.6116294628100951), ('3', 0.5227203204131482), ('4', 0.5227203204131482), ('2',
0.2818445200407242), ('5', 1.912726548603091e-11)]
Hub: [('1', 0.6116277710808059), ('2', 0.5227210022340776), ('3', 0.5227210022340776), ('5', 0.28184566217972573),
('4', 8.814056768667517e-12)]
```

### ● PageRank

```
The page rank is
[('1', 0.2), ('2', 0.2), ('3', 0.2), ('4', 0.2), ('5', 0.2)]
```

### ● SimRank

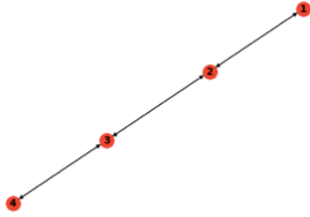
```
1 {'1': 1, '2': 0.0, '3': 0.0, '4': 0.0, '5': 0.0}
2 {'2': 1, '1': 0.0, '3': 0.0, '4': 0.0, '5': 0.0}
3 {'3': 1, '1': 0.0, '2': 0.0, '4': 0.0, '5': 0.0}
4 {'4': 1, '1': 0.0, '2': 0.0, '3': 0.0, '5': 0.0}
5 {'5': 1, '1': 0.0, '2': 0.0, '3': 0.0, '4': 0.0}
```

### ● Increase PageRank

The page rank in each node are the same because it is a one direction circular graph. I deleted the link from Node 1 to Node 2 and let Node 1 the last connected node.

```
The page rank is
[('1', 0.11125893749999999), ('5', 0.09559875), ('4', 0.077175), ('3', 0.055499999999999994), ('2', 0.03)]
```

## Graph\_3:



## ● HITS

```
Authority: [(('2', 0.6015010021765281), ('3', 0.6015010021765281), ('1',
0.37174795813915673), ('4', 0.37174795813915673))]
Hub: [(('2', 0.601500936990595), ('3', 0.601500936990595), ('1', 0.37174806361222146),
('4', 0.37174806361222146))]
```

## ● Increase hub, authority:

The authority and hub in Node 2 and Node 3 are higher than Node 1, therefore, I deleted the link between Node 2 and Node 3 and added 1 extra link “from” and “to” Node 1.

```
G.add_edge(('1', '3'))
G.add_edge(('4', '1'))
G.del_edge(('3', '2'))
```

```
Authority: [(('3', 0.7886752426205116), ('1', 0.5773499740575025), ('2', 0.21132526856300904), ('4',
2.2522047072484925e-07))]
Hub: [(('2', 0.6279629441866458), ('4', 0.6279629441866458), ('1', 0.4597010783725317), ('3',
1.0353404033888717e-07))]
```

## ● PageRank

```
The page rank is
[(('2', 0.3245697357468413), ('3', 0.32456848591113086), ('1', 0.17544349780773946),
('4', 0.17544160651223062))]
```

## ● SimRank

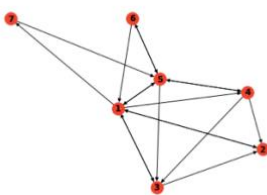
```
1 {'1': 1, '2': 0.0, '3': 0.4285714285714285, '4': 0.0}
2 {'2': 1, '1': 0.0, '3': 0.0, '4': 0.4285714285714285}
3 {'3': 1, '1': 0.4285714285714285, '2': 0.0, '4': 0.0}
4 {'4': 1, '1': 0.0, '2': 0.4285714285714285, '3': 0.0}
```

## ● Increase PageRank

```
G.del_edge(('3', '4'))
G.del_edge(('2', '3'))
```

```
The page rank is
[(('2', 0.4625089398931612), ('1', 0.4306355175213662), ('3', 0.06937499999999999),
('4', 0.0375))]
```

## Graph\_4:



## ● HITS

Authority: [('5', 0.5006347609412898), ('3', 0.4991383239620585), ('2', 0.4421933704113086), ('4', 0.34840650625216185), ('1', 0.34668245401905107), ('7', 0.20899857271768815), ('6', 0.13940793353447367)]  
Hub: [('1', 0.6464255415193828), ('4', 0.46620847138505), ('5', 0.43118342591755626), ('6', 0.27394982879729896), ('3', 0.2550548876256932), ('7', 0.16186241071032925), ('2', 0.1120874180869697)]

## ● PageRank

The page rank is

[('1', 0.2802968056839967), ('5', 0.18420266484553743), ('2', 0.1587691406286905), ('3', 0.13888562326497), ('4', 0.10822238115108199), ('7', 0.06907902839485086), ('6', 0.06057163770824813)]

## ● SimRank

```
1 {'1': 1, '2': 0.16616792299124677, '3': 0.1576679673960408, '4': 0.16537597420710273, '5': 0.14785559917758145, '6': 0.226085413082563054, '7': 0.1846653530857493}
2 {'2': 1, '1': 0.16616792299124675, '3': 0.21707712329538914, '4': 0.1828762640014616, '5': 0.21469699646791784, '6': 0.10114373968229441, '7': 0.26460878832062873}
3 {'3': 1, '1': 0.1576679673960408, '2': 0.21707712329538914, '4': 0.26201823520911904, '5': 0.1987679197049658, '6': 0.26139015574130126, '7': 0.26264631467693683}
4 {'4': 1, '1': 0.16537597420710273, '2': 0.1828762640014616, '3': 0.26201823520911904, '5': 0.1590951795289248, '6': 0.3443566797532744, '7': 0.3443566797532744}
5 {'5': 1, '1': 0.14785559917758145, '2': 0.21469699646791784, '3': 0.19876791970496577, '4': 0.1590951795289248, '6': 0.09377117066465336, '7': 0.22441918839319622}
6 {'6': 1, '1': 0.22608541302563054, '2': 0.1011437396822944, '3': 0.26139015574130126, '4': 0.3443566797532744, '5': 0.09377117066465336, '7': 0.08871335950654886}
7 {'7': 1, '1': 0.1046653530857493, '2': 0.26460878832062873, '3': 0.26264631467693683, '4': 0.3443566797532744, '5': 0.22441918839319622, '6': 0.08871335950654886}
```

## Graph\_5:

### ● HITS

Authority: [('61', 0.491350750412356), ('122', 0.4826466872326418), ('212', 0.29511453781675545), ('104', 0.28670802889936066), ('282', 0.25483217050924234), ('185', 0.25319096472726), ('348', 0.2219454736054275), ('325', 0.21657076404007825), ('148', 0.19539315562414852), ('134', 0.14462999942726787), ('381', 0.0781358140753339), ('154', 0.07491138570228442), ('326', 0.07441018474286566), ('160', 0.0664401594215989), ('216', 0.06258351865713711), ('404', 0.05704781477812911), ('164', 0.05166270308107531), ('278', 0.05166270308107531), ('141', 0.051038376273351585), ('315', 0.04668700046756116), ('55', 0.043794487538073086), ('81', 0.043794487538073086), ('415', 0.04151679062387608), ('412', 0.04101247162984225), ('297', 0.038205727389756715), ('299', 0.03700271411238557), ('193', 0.03640965846749884), ('184', 0.03474656840741783), ('174', 0.034208472422893495), ('133', 0.033722254517508175), ('88', 0.0308359378988937), ('451', 0.0262622348730531), ('50', 0.025782954146035365), ('18', 0.025270924641053318), ('224', 0.02506550573563301), ('426', 0.02506550573563301), ('343', 0.0238476390775159), ('130', 0.021087821974467326), ('249', 0.020710433074110066), ('303', 0.018020971846408523), ('85', 0.018020971846408523), ('429', 0.017806087570479065), ('58', 0.017570859380590213), ('353', 0.017343949309366728), ('25', 0.017259452510566525), ('118', 0.015701282671099652), ('198', 0.015701282671099652), ('48', 0.015701282671099652), ('178', 0.015253052613576472), ('320', 0.015253052613576472), ('181', 0.015140786826031444), ('179', 0.013425858250542778), ('182', 0.013425858250542778), ('176', 0.013425858250542778), ('112', 0.013425858250542778), ('155', 0.013425858250542778), ('186', 0.013425858250542778), ('115', 0.013425858250542778), ('125', 0.013425858250542778), ('293', 0.013425858250542778), ('283', 0.013425858250542778), ('254', 0.013425858250542778), ('220', 0.013425858250542778), ('200', 0.013425858250542778), ('213', 0.013425858250542778), ('371', 0.013425858250542778), ('329', 0.013425858250542778), ('38', 0.013425858250542778), ('456', 0.013425858250542778), ('434', 0.013425858250542778), ('450', 0.013425858250542778), ('458', 0.013425858250542778), ('455', 0.013425858250542778), ('78', 0.013425858250542778), ('75', 0.013425858250542778), ('95', 0.013425858250542778), ('37', 0.012626691943243626), ('194', 0.01163964748509233), ('359', 0.01163964748509233), ('285', 0.011120863746173888),

## ● PageRank

The page rank is

[('61', 0.0028632188131482612), ('122', 0.002818091005547667), ('104', 0.0020501241861042275), ('212', 0.0015579756663930675), ('282', 0.0014777901462927566), ('185', 0.0014516335933814671), ('325', 0.0014347425785457917), ('348', 0.0013738085061384296), ('148', 0.0012034640016704966), ('96', 0.0011844341642238399), ('44', 0.000941236831193966), ('134', 0.000906631067027147), ('94', 0.0008508225787519445), ('24', 0.0008501182812214586), ('287', 0.0008386895350124991), ('40', 0.000838665733339617), ('43', 0.0007721660224499559), ('21', 0.000768058945809749), ('284', 0.0007512930621016642), ('454', 0.0007478522168039459), ('22', 0.0007467805644945037), ('327', 0.0007452379873701883), ('363', 0.0007375197297007083), ('277', 0.0007373225284821048), ('264', 0.0007321867470051605), ('433', 0.000718376205265767), ('301', 0.0007181486078173274), ('152', 0.0007058938981188416), ('386', 0.0007054760618733073), ('249', 0.00069899086440959973), ('381', 0.0006848147002367932), ('457', 0.0006740346801683613), ('413', 0.0006699155733780782), ('265', 0.0006633543695540123), ('372', 0.0006523783305094864), ('331', 0.0006268316650409096), ('326', 0.0006098287478981605), ('300', 0.0005800661918470575), ('291', 0.0005760683049296528), ('189', 0.0005760680911379564), ('141', 0.0005745202063971757), ('202', 0.000571426290213768), ('92', 0.000560267573369101), ('444', 0.0005629363691149119), ('436', 0.0005629363691149119), ('273', 0.0005552519604448387), ('307', 0.0005551587211009654), ('216', 0.0005503464256760618), ('404', 0.0005409537663910288), ('460', 0.0005357500600488138), ('187', 0.000526782411453915), ('46', 0.000526782410623813), ('105', 0.0005239770220370778), ('167', 0.0005203601375519628), ('130', 0.000519346302882366), ('154', 0.0005181515166003628), ('439', 0.000517367065840691), ('35', 0.00051706620206475), ('70', 0.0005144406919829635), ('166', 0.0005143347139115403), ('116', 0.0005143347139115403), ('114', 0.0005143347139115403), ('350', 0.0005143347098752686), ('259', 0.0005129824799015182), ('63', 0.0005129824790469524), ('160', 0.0005013932186543564), ('459', 0.0004995969095577149), ('191', 0.0004940296318888647), ('33', 0.000493996517725036), ('424', 0.000493996517725036), ('109', 0.0004931855087329666), ('253', 0.0004866166964638118), ('162', 0.00048464152452025585), ('469', 0.00048464152452025585), ('279', 0.00048464152452025585), ('411', 0.0004844641314987975), ('435', 0.0004844641314987975), ('332', 0.0004804013575135108), ('30', 0.0004804013575135108), ('68', 0.00047763978928851), ('126', 0.0004770918478533076), ('323', 0.0004637608443075831), ('398', 0.0004637608443075831), ('164', 0.00046051908191491306), ('270', 0.00046051908191491306), ('296', 0.00045919903942387186), ('219', 0.00045919903942387186), ('235', 0.00045919903942387186), ('336', 0.00045919903942387186), ('390', 0.000455349095758291), ('34', 0.0004499358188104666), ('330', 0.0004499358188104666),

## ● SimRank



- HITS

```

Authority: [{"Coffee", 0.9547570811263789}, {"Tea", 0.1529229899345557}, {"Cake", 0.14198117176909233}, {"Juice", 0.09087862992523171}, {"Sandwich", 0.07653192341063723}, {"Eggs", 0.05596803535265135}, {"Frittata", 0.05596803535265135}, {"Scone", 0.05596803535265135}, {"Brioche and salami", 0.05596803535265135}, {"Jam", 0.05596803535265135}, {"Vegan mincepie", 0.05596803535265135}, {"Argentina Night", 0.04470764762492578}, {"Crisps", 0.04316344401145739}, {"Art Tray", 0.03963665672467769}, {"Jammie Dodgers", 0.038313306169821294}, {"Ella s Kitchen Pouches", 0.038313306169821294}, {"Bread", 0.03689526668596129}, {"Cookies", 0.03415726436646664}, {"Muffin", 0.03297746551781947}, {"Keeping It Local", 1.7515012281662267e-15}, {"Tshirt", 1.7515012281662267e-15}, {"Scandinavian", 1.7515012281662267e-15}, {"Truffles", 1.7515012281662267e-15}, {"Pick and Mix Bowls", 1.7515012281662267e-15}, {"Hot chocolate", 0.0}, {"Brownie", 0.0}, {"Toast", 0.0}, {"Focaccia", 0.0}, {"Coke", 0.0}, {"Valentine s card", 0.0}, {"Duck egg", 0.0}, {"Tartine", 0.0}, {"Bowl Nic Pitt", 0.0}, {"The Nomad", 0.0}, {"Chicken Stew", 0.0}, {"Extra Salami or Feta", 0.0}, {"Salad", 0.0}, {"Vegan Feast", 0.0}, {"Muesli", 0.0}, {"Lemon and coconut", 0.0}, {"Soup", 0.0}, {"Nomad bag", 0.0}, {"Hack the stack", 0.0}, {"Baguette", 0.0}, {"Afternoon with the baker", 0.0}, {"Empanadas", 0.0}, {"Hearty Seasonal", 0.0}, {"Spanish Brunch", 0.0}, {"Pastry", 0.0}, {"Tacos Fajita", 0.0}, {"Bread Pudding", 0.0}, {"Medialuna", 0.0}, {"Smoothies", 0.0}, {"Basket", 0.0}]
Hub: [{"Bread", 0.3063839711484806}, {"Sandwich", 0.2362261989540766}, {"Juice", 0.20968187918560605}, {"Tea", 0.20856611669523903}, {"Cake", 0.20239639280840085}, {"Hot chocolate", 0.19517967979239265}, {"Pastry", 0.19105958471835818}, {"Medialuna", 0.1806954010607278}, {"Soup", 0.1804798270556596}, {"Toast", 0.17445415214774937}, {"Focaccia", 0.17445415214774937}, {"Duck egg", 0.17445415214774937}, {"Scandinavian", 0.17445415214774937}, {"Bowl Nic Pitt", 0.17445415214774937}, {"The Nomad", 0.17445415214774937}, {"Jammie Dodgers", 0.17445415214774937}, {"Extra Salami or Feta", 0.17445415214774937}, {"Salad", 0.17445415214774937}, {"Lemon and coconut", 0.17445415214774937}, {"Pick and Mix Bowls", 0.17445415214774937}, {"Nomad bag", 0.17445415214774937}, {"Scone", 0.17445415214774937}, {"Cookies", 0.17445415214774937}, {"Empanadas", 0.17445415214774937}, {"Tacos Fajita", 0.17445415214774937}, {"Bread Pudding", 0.17445415214774937}, {"Smoothies", 0.17445415214774937}, {"Basket", 0.17445415214774937}, {"Afternoon with the baker", 0.03611265970969524}, {"Muesli", 0.027942240660651475}, {"Spanish Brunch", 0.027942240660651475}, {"Brownie", 0.02594293923717161}, {"Chicken Stew", 0.013983988257084138}, {"Hack the stack", 0.007242448869525318}, {"Hearty Seasonal", 0.00674153938755914}, {"Vegan Feast", 0.0062412489129784286}, {"Coke", 0.3.200360256925238e-16}, {"Valentine s card", 0.3.200360256925238e-16}, {"Tartine", 0.3.200360256925238e-16}, {"Coffee", 0.3.200360256925238e-16}, {"Baguette", 0.3.200360256925238e-16}, {"Keeping It Local", 0.0}, {"Eggs", 0.0}, {"Muffin", 0.0}, {"Tshirt", 0.0}, {"Argentina Night", 0.0}, {"Truffles", 0.0}, {"Frittata", 0.0}, {"Brioche and salami", 0.0}, {"Crisps", 0.0}, {"Jam", 0.0}, {"Vegan mincepie", 0.0}, {"Art Tray", 0.0}, {"Ella s Kitchen Pouches", 0.0}]

```

## ● PageRank

```

The page rank is
[{"Coffee", 0.0719950407378087}, {"Keeping It Local", 0.06397370496194216}, {"Tea", 0.015469277414742714}, {"Cake", 0.011446041901791135}, {"Argentina Night", 0.008341332295309653}, {"Sandwich", 0.006684472222222222}, {"Cookies", 0.006319444444444444}, {"Bread", 0.005925925925925926}, {"Art Tray", 0.005897435185185185}, {"Tshirt", 0.005138888888888889}, {"Scandinavian", 0.005138888888888889}, {"Truffles", 0.005138888888888889}, {"Pick and Mix Bowls", 0.005138888888888889}, {"Juice", 0.00462037037037037}, {"Crisps", 0.004198228125}, {"Muffin", 0.003958333333333334}, {"Jammie Dodgers", 0.003536324074074074}, {"Ella s Kitchen Pouches", 0.003536324074074074}, {"Eggs", 0.003281481481481481}, {"Frittata", 0.003281481481481481}, {"Scone", 0.003281481481481481}, {"Brioche and salami", 0.003281481481481481}, {"Jam", 0.003281481481481481}, {"Vegan mincepie", 0.003281481481481481}, {"Hot chocolate", 0.002777777777777778}, {"Brownie", 0.002777777777777778}, {"Toast", 0.002777777777777778}, {"Focaccia", 0.002777777777777778}, {"Coke", 0.002777777777777778}, {"Valentine s card", 0.002777777777777778}, {"Duck egg", 0.002777777777777778}, {"Tartine", 0.002777777777777778}, {"Bowl Nic Pitt", 0.002777777777777778}, {"The Nomad", 0.002777777777777778}, {"Chicken Stew", 0.002777777777777778}, {"Extra Salami or Feta", 0.002777777777777778}, {"Salad", 0.002777777777777778}, {"Vegan Feast", 0.002777777777777778}, {"Muesli", 0.002777777777777778}, {"Lemon and coconut", 0.002777777777777778}, {"Soup", 0.002777777777777778}, {"Nomad bag", 0.002777777777777778}, {"Hack the stack", 0.002777777777777778}, {"Baguette", 0.002777777777777778}, {"Afternoon with the baker", 0.002777777777777778}, {"Empanadas", 0.002777777777777778}, {"Hearty Seasonal", 0.002777777777777778}, {"Spanish Brunch", 0.002777777777777778}, {"Pastry", 0.002777777777777778}, {"Tacos Fajita", 0.002777777777777778}, {"Bread Pudding", 0.002777777777777778}, {"Medialuna", 0.002777777777777778}, {"Smoothies", 0.002777777777777778}, {"Basket", 0.002777777777777778}]

```

## Discussion:

### ● Link analysis algorithms really find the “important” pages from Web?

I think it is hard to get the important pages by using only one algorithm from web. For example, in graph\_1 from authority and hub it is hard to see that Node 6 is the last reference but after we check the pagerank we can see the answer. In this way, we can see what website people stop at the end and it might be the important pages. In the other hand, we might find many pages which people just press by accident.

### ● Any new idea about the link analysis algorithm?

I think these three algorithms consider previous and next nodes. But in the real world, what if there is a malicious website which keep showing up then it will become an important webpage. Therefore, I think maybe there’s a way to calculate the bad website or low score nodes and split into real bad webpage and miss-calculated bad webpages then add as minus points in the algorithm so that we can have more confidential results.

### ● What is the effect of “C” parameter in SimRank?

C is like confidence level in the formula. It means how fast it decay.

### ● What you learned from this project?

In this chapter I learned many common approaches to link analysis and also implement three ways with examples. Even I got the answers there are still many relationships between data need to be observed. For hub and authority, it considers how many pages are linked to them or how many pages they link to. For pagerank, I think it

considers the history status like after how many pages before it. And simrank considers who links to them. I think they cover different perspective. However, how to know that the pages we are calculating are all important pages will be another difficult works.