

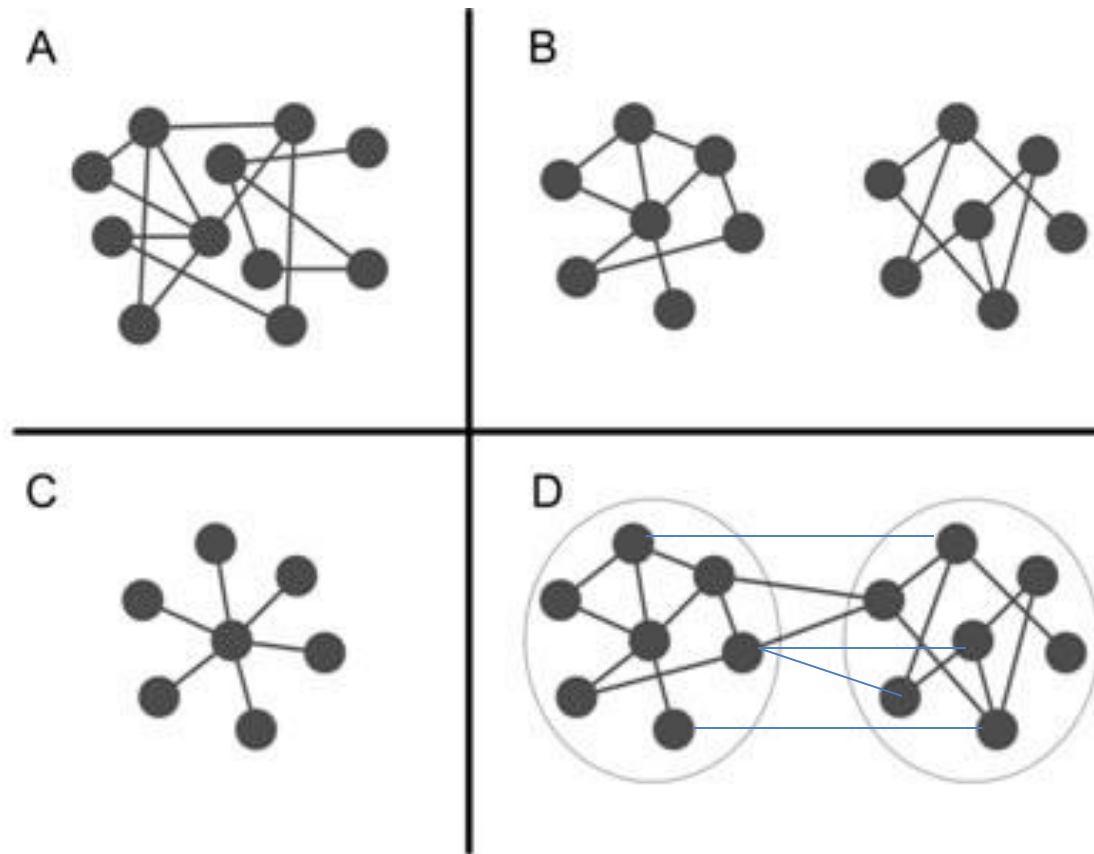
SNA

Cohesion, geodesic distance

Cohesion

- **Don't confuse the measure with the construct**
- Many ways to define or theoretically conceive of cohesion
- What is the mechanism that would relate cohesion to the outcome of interest?
- Define cohesion consistent with this mechanism
- For each way, we can then devise an operational measurement

Cohesion



Cohesions

- Network > Cohesion > Density
- Network > Cohesion > Reachability
- Network > Cohesion > No. of Geodesics
 - Geodesics?
- Network > Cohesion > Point Connectivity

More functions...

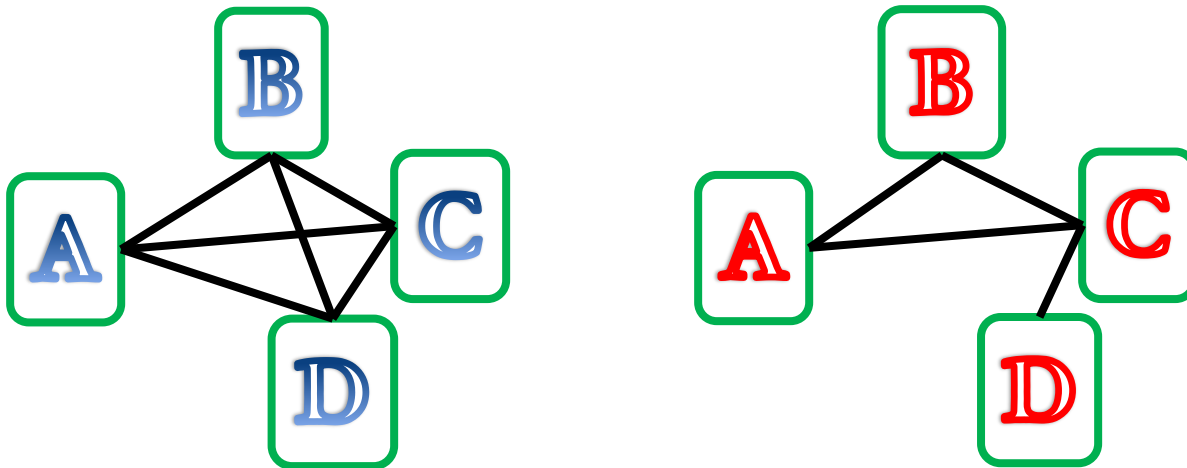
- Network>Cohesion>Density>Density of subgroups
- Network>Network properties>Reciprocity
 - For directional network
- Network>Cohesion>E-I index

Density

- An index of the degree of dyadic connection in a group
 - Binary data
 - The ration of the number of adjacencies that are present divided by the number of all possible pairs

Density

- The density of a binary network is the total number of ties divided by the total number of possible ties



Density

- Valued data
 - **The sum of the values of all ties divided by the number of possible ties**
 - The average strength of ties of across all possible (not all actual) ties

Density by group

- Identify subgroups in a network
- Calculate the density, sum or average value **within** and **between** groups in a network or matrix.

Density by groups

Open KNOKBUR

Create an attribute file ([###d](#) [###h](#))

- Group 1: governmental agencies: coun, educ, mayr 2
out of 3 links present
- Group 2: non-governmental agencies : comm, indu,
news
- Group 3: welfare specialists: wro, uway, welf, west

Density in UCINET and Gephi

Try Network>Cohesion>Overall Density

Try Network>Cohesion>Density by group

KNOKBUR

You gonna need attribute data

##D#, ##H

Also show the attributes using NetDraw

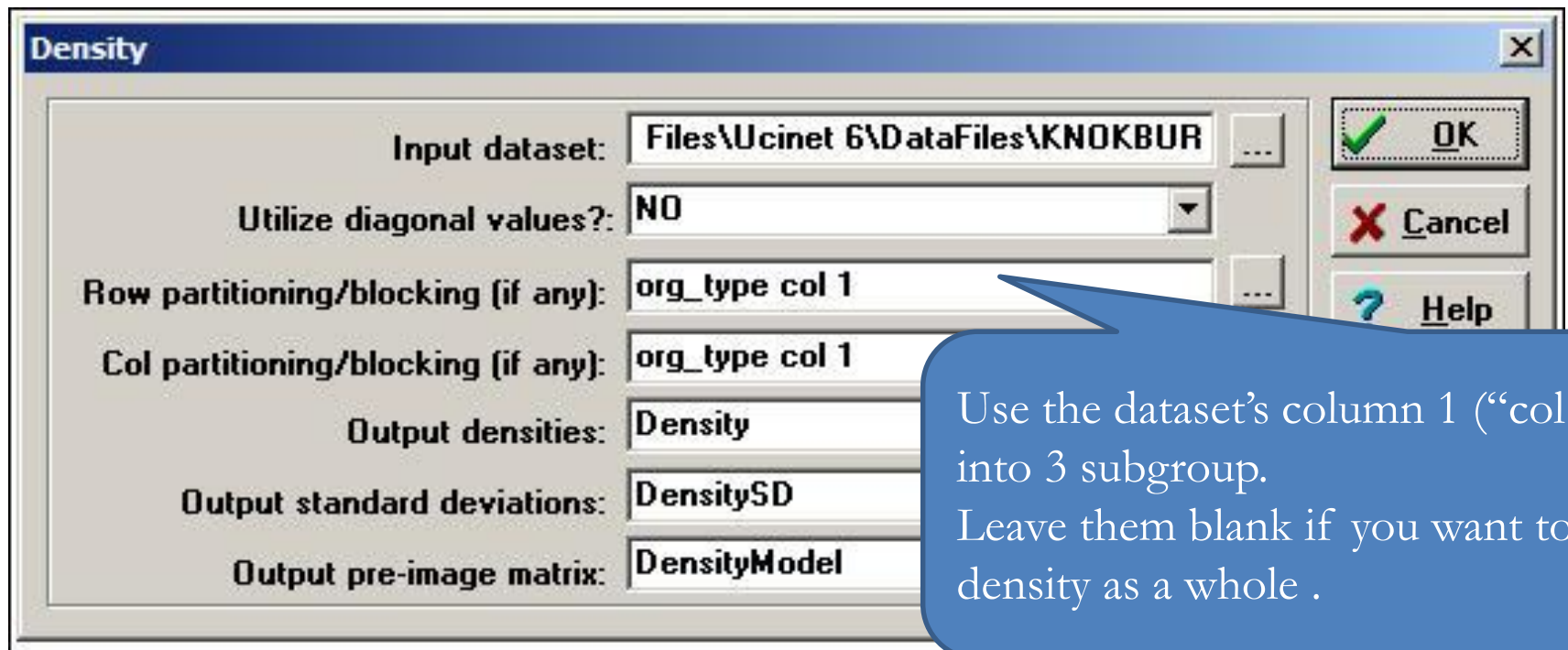
Do the same exercise with friendship data

Density

- Exercise/unpack KRACK-HIGH-TECH
 - Open KRACKAD and KRACKFR from NetDraw
 - Use UCINET to compare the density between friendship and advice seeking density
 - Network>cohesion>density (overall)
 - * by group ? (Please use the old procedure, I have run into all kinds of problems with the “New”)

Within group density

- *Network>Cohesion>Density*
 - To calculate the density of whole populations, or of **partitions**
 - We can use an attribute or partition to divide the cases



Column	Block	Old Code	Members:									
	1	1	COUN	EDUC	MAYR							
	2	2	COMM	INDU	NEWS							
	3	3	WRO	UWAY	WELF	WEST						

Relation: KNOKI

		1	3	5		2	4	7		6	8	9	0
		C	E	M		C	I	N		W	U	W	W
1				1		1		1				1	
3				1		1	1	1		1			1
5		1	1			1	1	1			1	1	1
2		1	1	1			1	1			1	1	
4		1		1		1		1					
7				1		1	1						
6			1					1				1	
8		1		1		1	1	1				1	
9				1		1		1					
10		1	1	1		1		1					

This shows the way you partitioned the cases. “Old Code” is from column 1.

The three sub-groups and the connections WITHIN them.

Density / average value within blocks

		1	2	3
		1	2	3
		-----	-----	-----
1	1	0.6667	0.8889	0.5000
2	2	0.6667	1.0000	0.1667
3	3	0.5833	0.6667	0.1667

The density within-
and between-blocks.

Standard Deviations within blocks

		1	2	3
		1	2	3
		-----	-----	-----
1	1	0.4714	0.3143	0.5000
2	2	0.4714	0.0000	0.3727
3	3	0.4930	0.4714	0.3727

The SD within- and between-
blocks.

Exercise, apply density analysis on NTNU data

Simplified NTNU

Save into excel file then open with Gephi

The screenshot shows the 'Density Within/Between Groups' dialog box in Gephi. The dialog is titled 'Density Within/Between Groups' and has a standard Windows window frame with minimize, maximize, and close buttons. It is divided into two main sections: 'Files' and 'Options'.

Files Section:

- Network Dataset:** A text field containing 'I:\社會網絡demo\0319\AllSchool_net.##h' with a browse button (...).
- Dataset containing Row Partition (defining groups of nodes):** A text field containing 'I:\社會網絡demo\0319\AllSchool_attr.##h' with a browse button (...). To the right are dropdown menus for 'Column' (set to 'School affiliatio'), 'C' (set to 'C'), 'I' (set to 'I'), and a 'Value Labels' button.
- Dataset containing Column Partition (defining groups of nodes):** A text field containing 'I:\社會網絡demo\0319\AllSchool_attr.##h' with a browse button (...). To the right are dropdown menus for 'Column' (set to 'School affiliatio'), 'C' (set to 'C'), 'I' (set to 'I'), and a 'Value Labels' button.
- Common prefix for all output datasets:** A text field containing 'AllSchool_net_DbyGroup'.

Options Section:

- Utilize diagonal (reflexive ties):** A checkbox that is currently unchecked.

Buttons: On the right side of the dialog, there are three buttons: 'OK' (with a green checkmark icon), 'Cancel' (with a red X icon), and 'Help' (with a blue question mark icon).

Density by groups

Number of ties/Sum of tie-strengths

	1 0	2 1	3 2	4 3	5 4	6 5	7 6	8 7	9 8
1 0	0.000	1.000	1.000	0.000	0.000	0.000	0.000	0.000	0.000
2 1	1.000	138.000	35.000	19.000	25.000	14.000	19.000	0.000	16.000
3 2	0.000	36.000	79.000	21.000	16.000	6.000	30.000	4.000	47.000
4 3	0.000	10.000	25.000	118.000	17.000	9.000	9.000	6.000	85.000
5 4	0.000	4.000	1.000	12.000	59.000	12.000	15.000	2.000	14.000
6 5	1.000	20.000	14.000	12.000	36.000	30.000	24.000	5.000	12.000
7 6	0.000	7.000	11.000	11.000	11.000	16.000	61.000	2.000	15.000
8 7	0.000	11.000	6.000	2.000	5.000	4.000	1.000	19.000	10.000
9 8	0.000	3.000	9.000	16.000	1.000	4.000	1.000	7.000	11.000

Density (prop of ties) / Average tie strength

	1 0	2 1	3 2	4 3	5 4	6 5	7 6	8 7	9 8
1 0	0.000	0.009	0.010	0.000	0.000	0.000	0.000	0.000	0.000
2 1	0.009	0.197	0.052	0.032	0.042	0.027	0.050	0.000	0.008
3 2	0.000	0.053	0.132	0.038	0.029	0.013	0.086	0.020	0.026
4 3	0.000	0.017	0.045	0.255	0.035	0.022	0.029	0.034	0.054
5 4	0.000	0.007	0.002	0.025	0.128	0.029	0.049	0.011	0.009
6 5	0.013	0.039	0.029	0.029	0.086	0.088	0.090	0.033	0.009
7 6	0.000	0.019	0.031	0.036	0.036	0.060	0.335	0.018	0.015
8 7	0.000	0.051	0.030	0.011	0.028	0.026	0.009	0.339	0.018
9 8	0.000	0.002	0.005	0.010	0.001	0.003	0.001	0.012	0.002

Reachability

- An actor is reachable by another if there exists any set of connections by which we can trace from the source to the target actor, **regardless of how many others fall between them.**

Reachability of Knoke "I" and "M" relations

Matrix #1

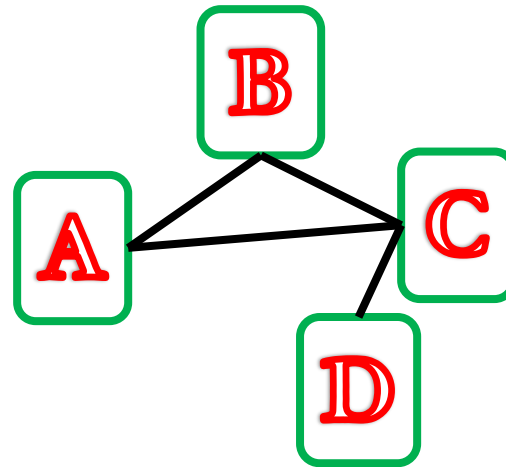
[illegible]

Matrix #2

[illegible]

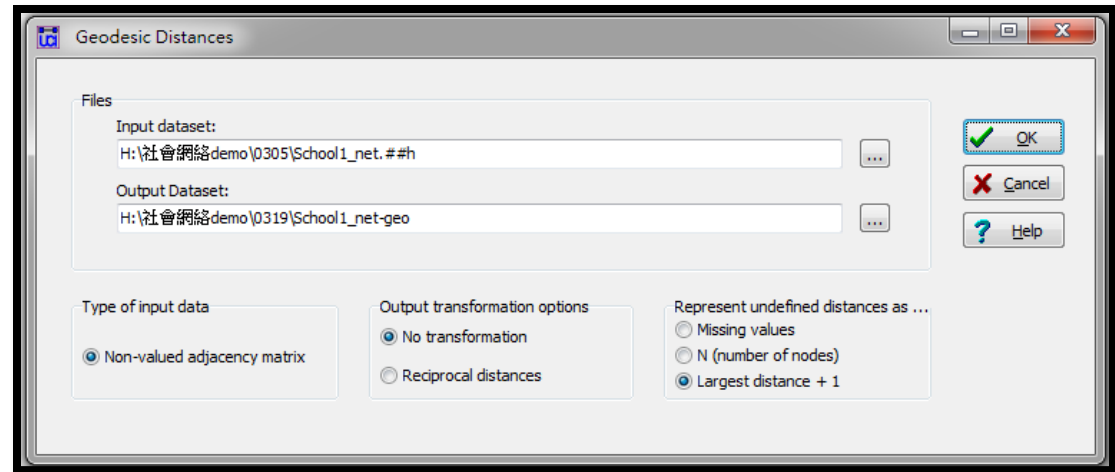
(Geodesic) Distance

- The distance between two nodes is the length of the shortest path.
- Isolates?



Distance

- Choose input, choose output.
- Use default settings.
- Suggestion: **save the text file** for average and frequencies.



	Actor1	Actor2	Actor3	Actor4	Actor5	Actor6	Actor7
Actor1	0	2	2	1	1	2	3
Actor2	2	0	1	2	1	2	3
Actor3	2	3	0	2	1	2	3
Actor4	1	1	1	0	1	1	2
Actor5	1	2	1	1	0	1	2
Actor6	1	1	1	1	1	0	1
Actor7	2	2	2	1	1	1	0

Geodesic distances for Knoke information exchange

Geodesic Distances											
		1	2	3	4	5	6	7	8	9	10
		C	C	E	I	M	W	N	U	W	W
		-	-	-	-	-	-	-	-	-	-
1		0	1	2	2	1	3	1	2	1	2
2		1	0	1	1	1	2	1	1	1	2
3		2	1	0	1	1	1	1	2	2	1
4		1	1	2	0	1	3	1	2	2	2
5		1	1	1	1	0	2	1	1	1	1
6		3	2	1	2	2	0	1	3	1	2
7		2	1	2	1	1	3	0	2	2	2
8		1	1	2	1	1	3	1	0	1	2
9		2	1	2	2	1	3	1	2	0	2
10		1	1	1	2	1	2	1	2	2	0

Compare 6 to 4 and 4 to 6, are they symmetrical

Save the output file and open it with netdraw

Reverse the value?

Who is close to the CEO ? Krack-high-tech

Distance in a valued graph: tie strength

- How to measure distance with valued data?
- The distance between two actors is defined as the strength of **the weakest link** in the shortest path.
 - If A sends 6 units to B, B sends 4 units to C, the strength of the path from A to C (**assuming A to B to C is the shortest path**) is 4.
 - Wolf/fn (first save the data into separate file, then use the OLD procedure)

No. of Geodesics

- Counts the number of different geodesic paths connecting each pair of nodes.
- Binary dataset only, or UCINET will warn you.
- What does the mean?

	Actor1	Actor2	Actor3	Actor4	Actor5	Actor6	Actor7	Actor8
Actor1	1	1	2	1	1	2	2	1
Actor2	1	1	1	1	1	1	1	2
Actor3	1	2	1	1	1	1	1	2
Actor4	1	1	1	1	1	1	1	2
Actor5	1	2	1	1	1	1	1	2
Actor6	1	1	1	1	1	1	1	1
Actor7	3	2	3	1	1	1	1	1
Actor8	0	0	0	0	0	0	0	1

Who can influence the CEO ? Krack-high-tech

Number of geodesic paths for Knoke information exchange

# of Geodesic Paths										
	1	2	3	4	5	6	7	8	9	0
	C	C	E	I	M	W	N	U	W	W
	—	—	—	—	—	—	—	—	—	—
1	1	1	2	3	1	2	1	2	1	1
2	1	1	1	1	1	1	1	1	1	2
3	4	1	1	1	1	1	1	2	3	1
4	1	1	2	1	1	2	1	2	3	1
5	1	1	1	1	1	1	1	1	1	1
6	9	3	1	2	3	1	1	6	1	1
7	3	1	2	1	1	2	1	2	2	1
8	1	1	2	1	1	2	1	1	1	1
9	2	1	2	3	1	2	1	2	1	1
10	1	1	1	4	1	1	1	2	3	1

Next: Run on WOLFN data

Flow

- Complementing geodesic paths
- Taking into account ALL connections between pairs of actors, **not just the most efficient ones.**
- Network > Cohesion > Maximum Flow
 - How many different actors in the NEIGHBORHOOD of a source leads to pathways to a target.

Flow

- “If I need to send a message to you, and there is only one other person to whom I can send this for retransmission, my connection is weak— **even if the person I send it to may have many ways of reaching you.**
- If, on the other hand, there are four people to whom I can send my message, **each of whom has one or more ways of retransmitting my message to you,** then my connection is stronger.”

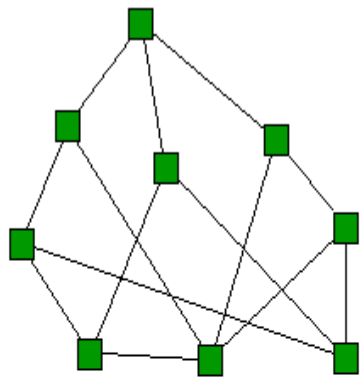
Maximum flow for Knoke information network

		1	2	3	4	5	6	7	8	9	10
		C	C	E	I	M	W	N	U	W	W
		—	—	—	—	—	—	—	—	—	—
1		0	4	3	4	4	1	4	2	4	2
2		5	0	3	5	7	1	7	2	5	2
3		5	6	0	5	6	1	6	2	5	2
4		4	4	3	0	4	1	4	2	4	2
5		5	8	3	5	0	1	8	2	5	2
6		3	3	3	3	3	0	3	2	3	2
7		3	3	3	3	3	1	0	2	3	2
8		5	6	3	5	6	1	6	0	5	2
9		3	3	3	3	3	1	3	2	0	2
10		5	5	3	5	5	1	5	2	5	0

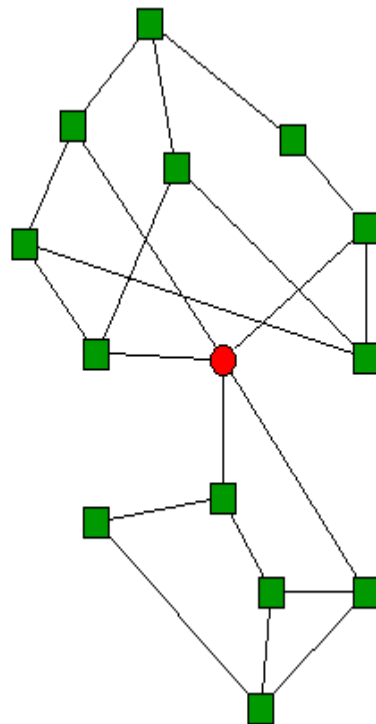
Who can influence the CEO ? Krack-high-tech

Global Connectivity

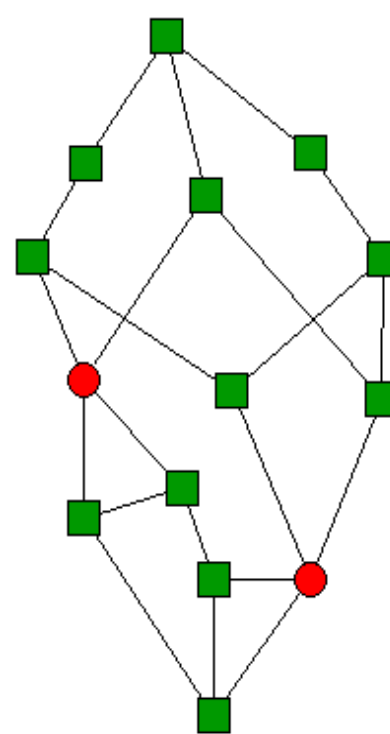
- Networks are structurally cohesive if they remain connected even when nodes are removed



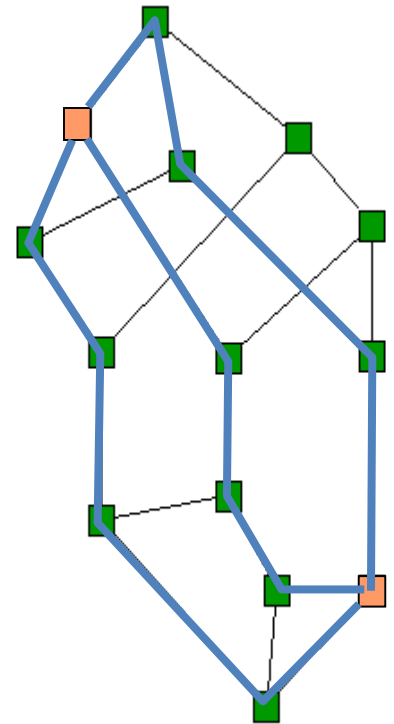
0



1



2



3

Node/point connectivity

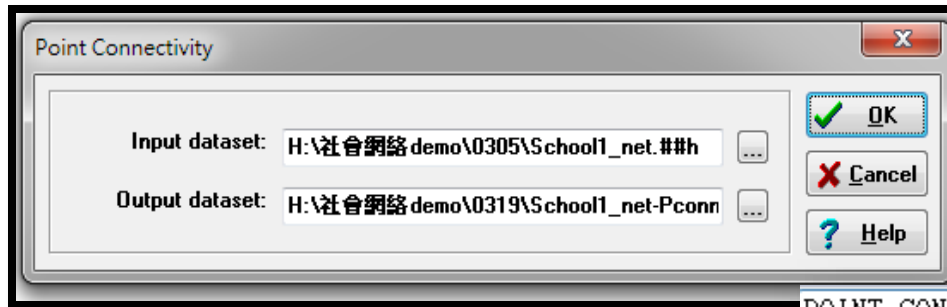
- The minimum number of nodes that need to be removed to disrupt the path **between any two pair of nodes.**
- Equal to the maximum number of **node independent path** between any two pair of nodes.

Point/local connectivity

- **NETWORK>COHESION>POINT CONNECTIVITY**
PURPOSE Compute the local point connectivity between all pairs of nodes in a network.
DESCRIPTION The local (point) connectivity of two non-adjacent vertices is the number of vertices that need to be deleted so that no path connects them, this is equal to the maximum number of vertex disjoint paths connecting them.
- **NOTE:** This procedure only operates on the first matrix in a dataset.
- **Hint:** data > unpack

Point Connectivity

- Compute the local point connectivity between all pairs of nodes in a network



POINT CONNECTIVITY

Input dataset: School1_net (H:\社會網絡demo\0305\School1_net.###)
Output connectivity: School1_net-Pconn (H:\社會網絡demo\0319\School1_net-Pconn)

		1	2	3	4	5	6	7
	Actor	Actor	Actor	Actor	Actor	Actor	Actor	Actor
1	Actor1	0.000	2.000	2.000	2.000	2.000	2.000	1.000
2	Actor2	1.000	0.000	2.000	1.000	2.000	1.000	1.000
3	Actor3	1.000	1.000	0.000	1.000	1.000	1.000	1.000
4	Actor4	3.000	2.000	4.000	0.000	5.000	2.000	1.000
5	Actor5	3.000	2.000	3.000	3.000	0.000	2.000	1.000
6	Actor6	3.000	2.000	4.000	4.000	6.000	0.000	1.000
7	Actor7	3.000	2.000	3.000	3.000	3.000	3.000	0.000

Local connectivity: the minimum # of nodes need to be removed to disconnect a pair of nodes

		1	2	3	4	5	6	7	8	9	10
		C	C	E	I	M	W	N	U	W	W
		-	-	-	-	-	-	-	-	-	-
1		5	5	3	4	5	1	6	4	4	3
2		5	8	3	5	8	1	6	5	3	4
3		3	3	4	4	3	1	4	3	3	3
4		5	5	3	5	5	1	5	4	3	4
5		5	8	3	5	8	1	6	5	3	5
6		1	1	1	1	1	1	2	1	2	1
7		5	6	3	5	6	1	6	4	2	3
8		5	5	3	5	5	1	5	5	4	4
9		3	3	3	3	3	1	3	3	3	3
10		4	5	3	4	5	1	4	4	3	5

Flow

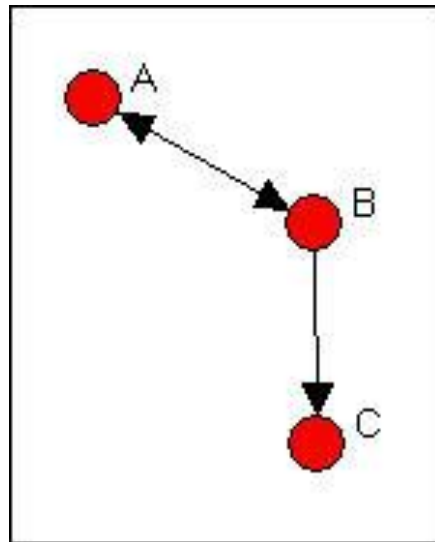
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Flow

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Reciprocity in directional network

- Four possible dyadic relationships with directed data
- A network that has a predominance of **null or reciprocated ties** over asymmetric connections may be a more “equal” or “stable” network than **one with a predominance of asymmetric connections**



Reciprocity

- $Network > Cohesion > Reciprocity$

- Method

- Arc-based:

- “Hybrid”

$$(A, B), (B, C), (C, A) > 1/3$$

- Dyad-based

All actual pairs

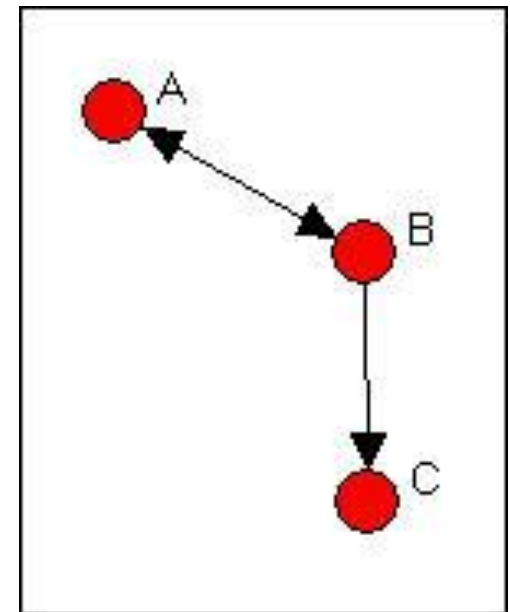
$$(A, B), (B, C) > 1/2$$

$$AB, BA, BC, CB, CA, AC > 1/3$$

All actual ties

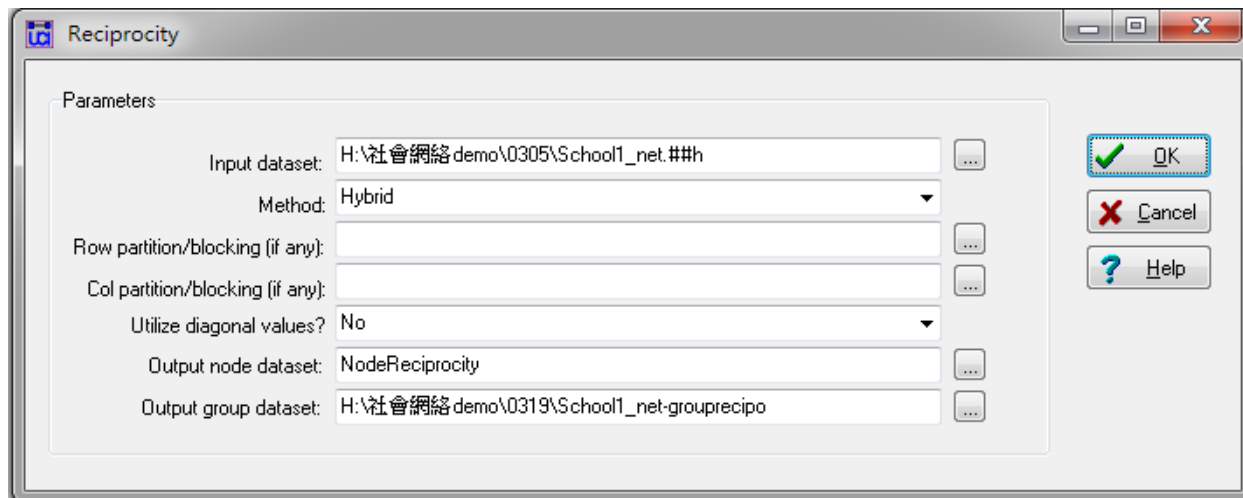
$$AB, BA, BC, CB, CA, AC > 2/3$$

Consider all possible pairs
Is less sensible in a large
network, why?

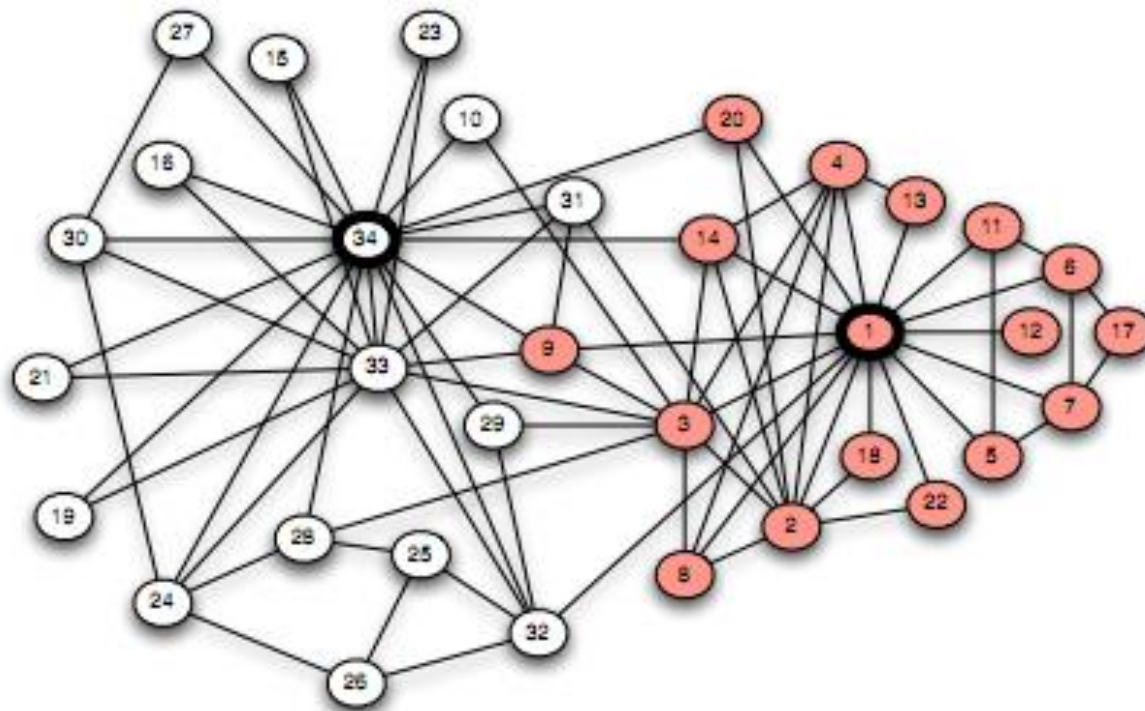


Reciprocity

- Calculate the amount of ties that are reciprocated in a network.
- Use default settings.
- Suggestion:
save the text file for detail info.



E-I: Group **E**xternal vs. **I**nternal ties



E-I: Group **E**xternal vs. **I**nternal ties

- Takes the number of external group ties, **subtracts** the number of internal ties, and divides by the **total number of ties**
- The lower the E-I, the higher the degree of **closure**
- Range from -1 (all ties are internal; homophile or closure) to +1 (all ties are external)
- **Directions of ties are ignored**

E-I index

- Units of analysis
 - Entire population
 - Each sub-group
 - Individual

External and internal ties

- Network > Cohesion > E-I index
 - Given a **partition** of a network into a number of **mutually exclusive groups**, then
 - the E-I index is the number of ties external to the groups minus the number of ties that are internal to the group divided by the total number of ties.

You can also try

Network > Cohesion > Homophily

more about this later

E-I Index

- *Network > Cohesion > E-I Index*
- Compare the numbers of ties within groups and between groups.
 - The directions of ties are ignored

E-I Index

Parameters

Input Dataset: :\\Program Files\\Ucinet 6\\DataFiles\\KNOKBUR|

Attribute: org_type col 1

Number of random perms: 5000

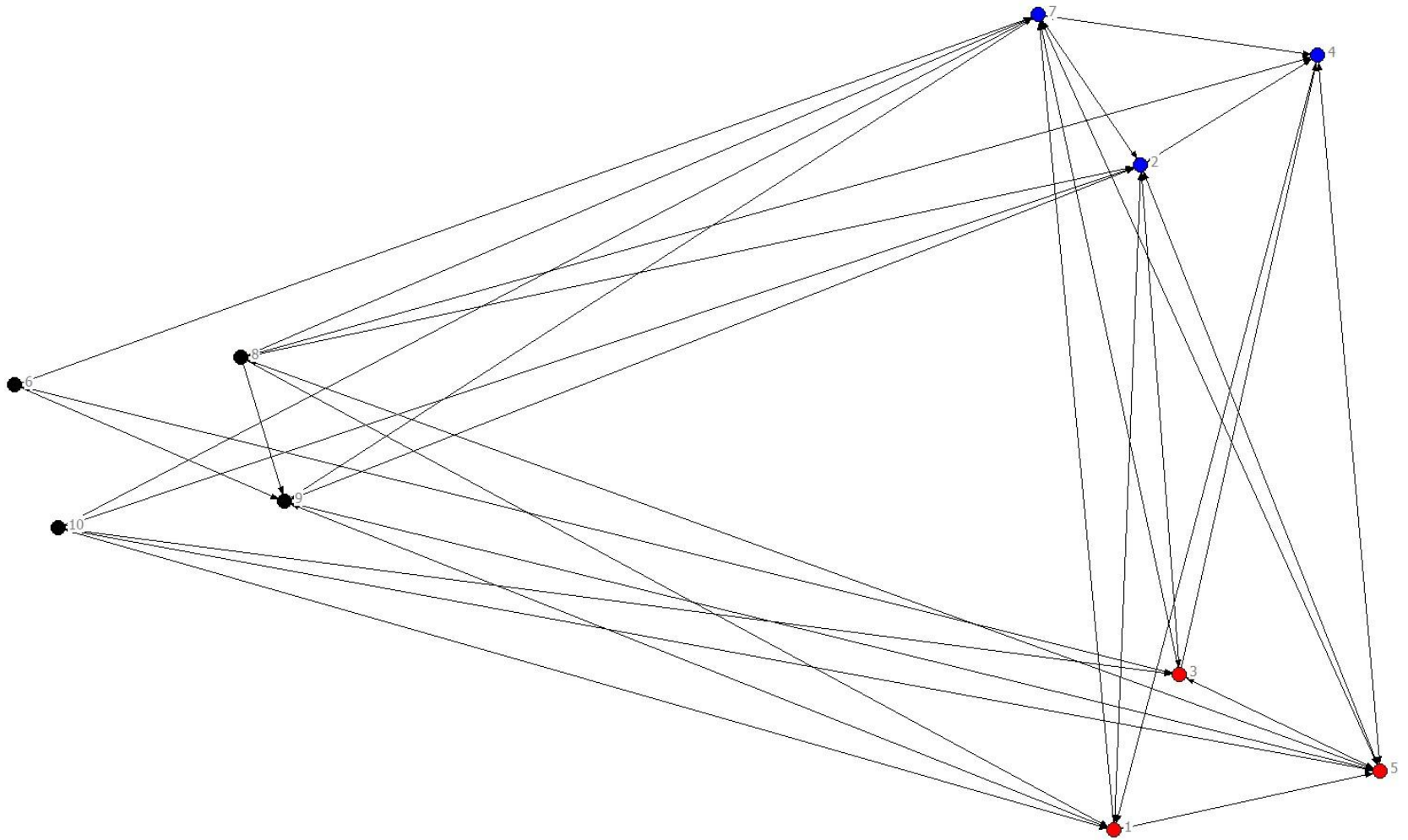
Diagonal values valid? NO

Random number seed: 23518

Output Dataset: IndE-I

Partition dataset into different sub-groups by “col 1”, and calculate the E-I index of the network

E-I



		1	2	3	4
		Freq	Pct	Possib	Densit
1	Internal	14.000	0.219	24.000	0.583
2	External	50.000	0.781	66.000	0.758
3	E-I	36.000	0.563	42.000	0.467

Max possible external ties: 66.000
Max possible internal ties: 24.000

E-I Index: 0.563
Expected value for E-I index is: 0.467

the expected value under a random distribution (given the size of the group and the overall density)

Max possible E-I given density & group sizes: 1.000
Min possible E-I given density & group sizes: 0.250

Re-scaled E-I index: -0.167

Re-scaled E-I Index by the demographic constraints and overall density.

Permutation Test
Number of iterations = 5000

P=.203, not significant

	1	2	3	4	5	6	7
	Obs	Min	Avg	Max	SD	P >= Ob	P <= Ob
1 Internal	0.219	0.625	0.733	0.844	0.039	1.000	0.000
2 External	0.781	0.156	0.267	0.375	0.039	0.000	1.000
3 E-I	0.563	0.250	0.467	0.688	0.078	0.203	0.953

Group level E-I Index

		1	2	3	4
		Intern	Extern	Total	E-I
1	1	4.000	17.000	21.000	0.619
2	2	6.000	17.000	23.000	0.478
3	3	4.000	16.000	20.000	0.600

Raw counts of ties within and between each group.

Individual Level E-I Index

	1	2	3	4
	Inter	Exter	Total	E-I
1	1.000	6.000	7.000	0.714
2	2.000	6.000	8.000	0.500
3	1.000	5.000	6.000	0.667
4	2.000	4.000	6.000	0.333
5	2.000	6.000	8.000	0.500
6	1.000	2.000	3.000	0.333
7	2.000	7.000	9.000	0.556
8	1.000	5.000	6.000	0.667
9	2.000	4.000	6.000	0.333
10	0.000	5.000	5.000	1.000

E-I Index for each group.

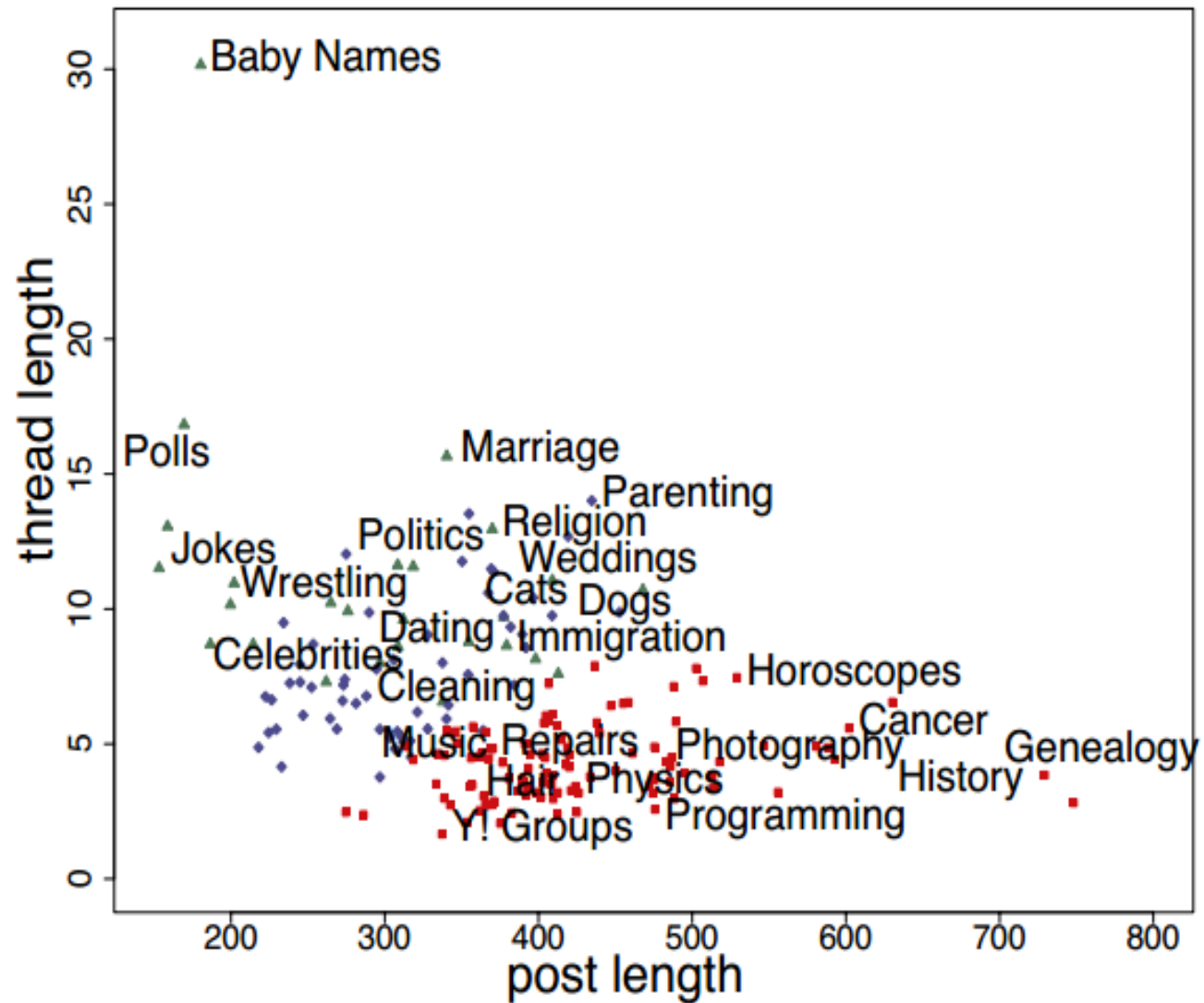
Exercise I

- Use [Friendship data](#) and do the following analyses
- 1. Run density within Gender and Club
- 2. Run E-I Index on both attributes and see if there exists homophily by either attribute
- 3. Identify the most outward/Inward - looking group and individuals
- 4. Which gender is more outward looking?

Exercise II

- Apply E-I index analysis on Krack High Tech, and Try both level (column 3) and department (column 4)
 - The procedure only runs on the first spreadsheet
 - Run on report-to network and check the E-I value

Yahoo Answers (YA)



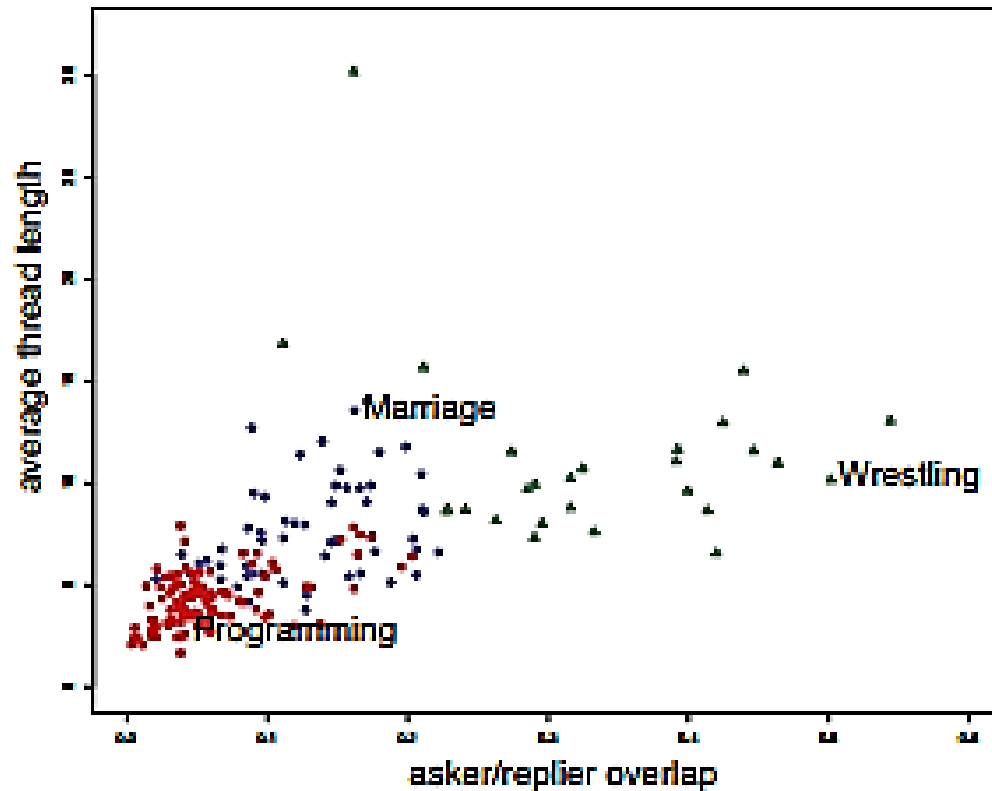


Figure 2: Clustering of categories by thread length and overlap between askers and repliers

Adamic, L. A., Zhang, J., Bakshy, E., & Ackerman, M. S. (2008, April). Knowledge sharing and yahoo answers: everyone knows something. In *Proceedings of the 17th international conference on World Wide Web* (pp. 665-674). ACM.

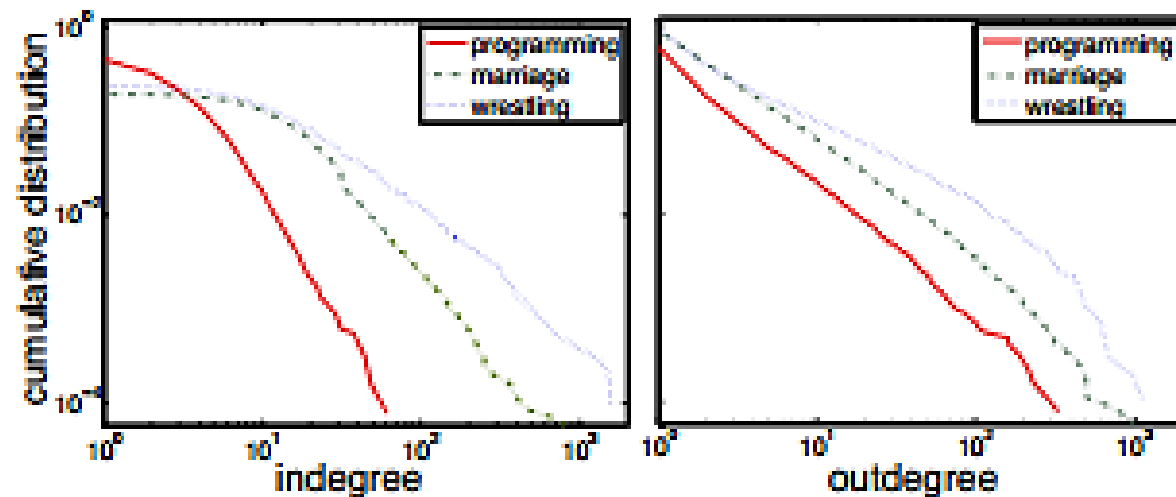


Figure 3: Distributions of indegree (number of users one has received answers from) and outdegree (number of users one has answered)

Adamic, L. A., Zhang, J., Bakshy, E., & Ackerman, M. S. (2008, April). Knowledge sharing and yahoo answers: everyone knows something. In *Proceedings of the 17th international conference on World Wide Web* (pp. 665-674). ACM.

Table 1: Summary statistics for selected QA networks

Category	Nodes	Edges	Avg. deg.	Mutual edges	SCC
Wrestling	9,959	56,859	7.02	1,898	13.5%
Program.	12,538	18,311	1.48	0	0.01%
Marriage	45,090	164,887	3.37	179	4.73%

Adamic, L. A., Zhang, J., Bakshy, E., & Ackerman, M. S. (2008, April). Knowledge sharing and yahoo answers: everyone knows something. In *Proceedings of the 17th international conference on World Wide Web* (pp. 665-674). ACM.

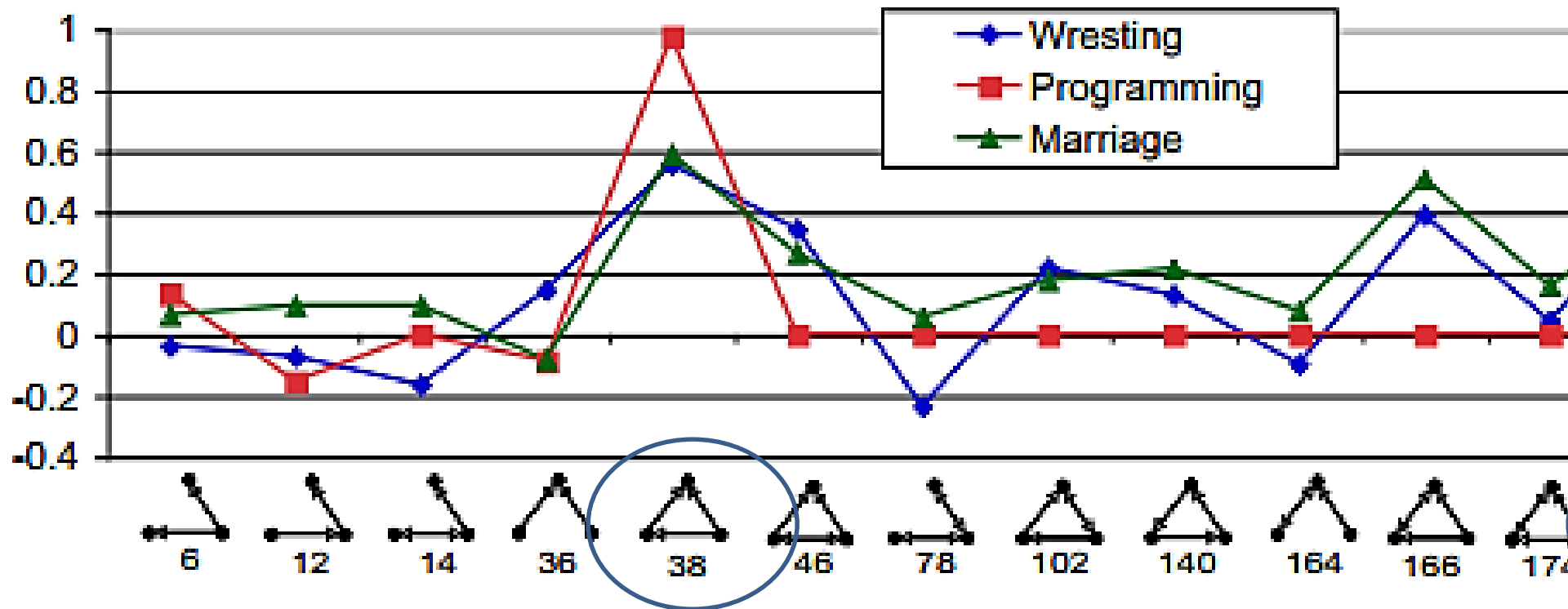


Figure 5: Motif profiles of selected categories

Adamic, L. A., Zhang, J., Bakshy, E., & Ackerman, M. S. (2008, April). Knowledge sharing and yahoo answers: everyone knows something. In *Proceedings of the 17th international conference on World Wide Web* (pp. 665-674). ACM.