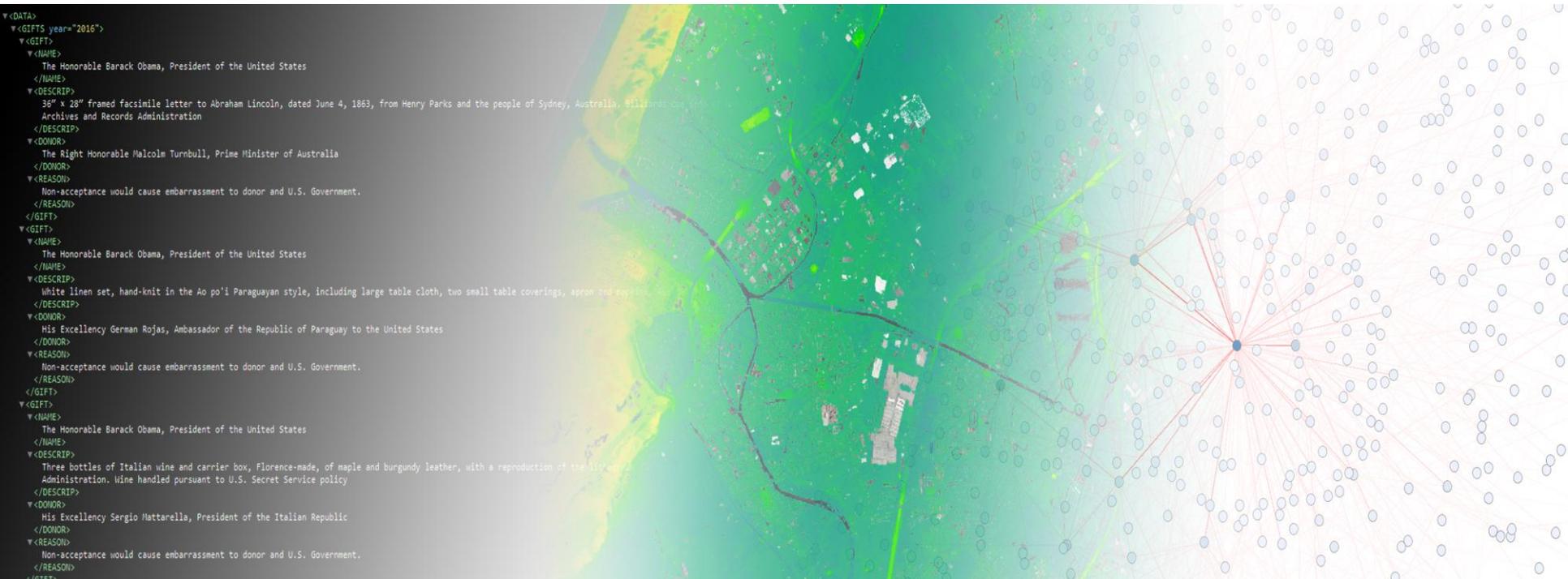


Information Visualization and the Humanities

Network Visualization

Martin Kroon
19-12-'22



Last time

- Data structure
 - The anatomy of XML
 - Relational databases
- Graph Theory
 - What is a graph?
- Graphs and Networks
 - Network is a specific type of graph: which one?

Today

- How do we visualize them?

Visualizing a network

(from last week)

- Often represented with circles and lines
- Size/colour of nodes and edges to indicate “importance”



Figure 1.4 Two graphical methods for showing the same set of relationships between entities.

But how do we get to something like this?



Today

- How do we visualize them?
- I asked you to install [Gephi](#)
 - Today we will be looking at the very basics
 - Try and do everything as I tell it!



Open Gephi now

- Ignore any pop-ups or wizards or welcome screens for now
- Download the Star Wars dataset from infovis.lucdh.nl
 - then unpack the zip somewhere!

What is Gephi?

- Network analysis and visualization software
- Open-source (so, good for FAIR science)
 - Developed by non-profit consortium
- Widely used in DH, academia in general and even journalism



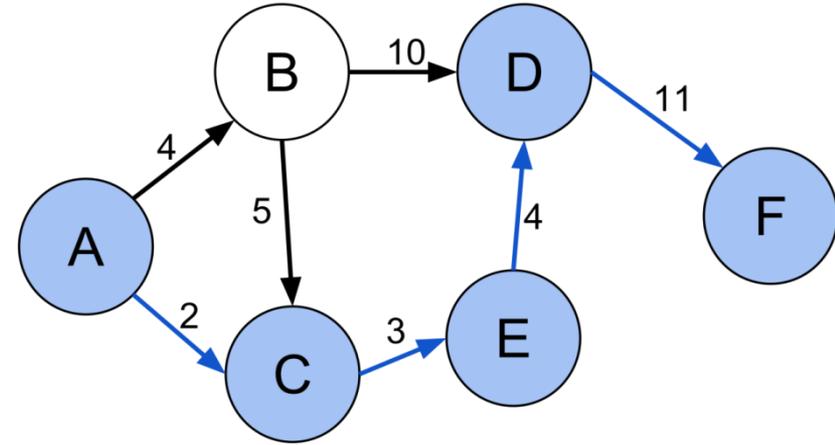
WARNING

Gp Gephi

does not support Ctrl-Z!
There is no undoing the done!

Graphs as csvs

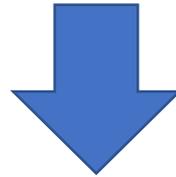
(from last week)



$$G = (V, E),$$

where $V = \{A, B, C, D, E, F\}$

and $E = \{(A, B, 4), (A, C, 2), (B, C, 5), (B, D, 10), (C, E, 3), (D, F, 11), (E, D, 4)\}$



Two csvs:

- one with nodes and its attributes
- one with edges and its attributes

Node_label
A
B
C
D
E
F

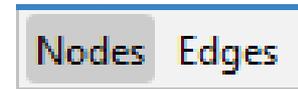
Tail	Head	Weight
A	B	4
A	C	2
B	C	5
B	D	10
C	E	3
D	F	11
E	D	4

Loading a csv in Gephi

- First, start a new, empty Workspace/Project
 - under File
- Under Data Laboratory, or Data Table (if you have it open)



- There are two tabs: Nodes and Edges:
 - We need to load both
- Let's first do Nodes



Loading Nodes

- Click Import Spreadsheet and choose your file
- A wizard pops up:
 - In the first step, you tell Gephi how to read your csv
 - In the second step, you tell Gephi which columns to import and how to interpret time (if present in the data)
 - Click Finish
- An import report pops up:
 - Define the Graph Type (when loading nodes only, this is maybe not very relevant, but to be sure, already choose the correct type)
 - Check either New workspace or Append to existing workspace
- Should look something like this:

	Id	Label	Interval	name	value	colour
0				NUTE GUNRAY	20	#808080
1				QUI-GON	84	#444b1
2				TC-14	5	#808080
3				PK-4	2	#808080
4				OBI-WAN	35	#48D1CC
5				YODA	9	#9ACD32
6				DOFINE	3	#808080
7				RUNE	17	#808080
8				TEY HOW	4	#808080
9				VALORUM	6	#808080
10				RABE	15	#808080
11				EMPEROR	19	#191970
12				CAPTAIN PANAKA	34	#808080
13				SIO BIBBLE	11	#808080
14				JAR JAR	60	#9a9a00
15				TARPALS	3	#808080
16				BOSS NASS	6	#808080
17				PADME	52	#DDA0DD
18				RIC OLIE	14	#808080
19				R2-D2	39	#bde0f6
20				ANAKIN	62	#ce3b59
21				WATTO	16	#808080
22				SEBULBA	11	#808080
23				JIRA	3	#808080
24				C-3PO	6	#FFD700
25				SHMI	16	#808080
26				DARTH MAUL	18	#808080
27				KITSTER	11	#808080
28				WALD	3	#808080
29				GREEDO	3	#808080
30				FODE/BEED	11	#808080
31				JABBA	5	#808080
32				MACE WINDU	5	#808080
33				KI-ADI-MUNDI	4	#808080
34				BAIL ORGANA	3	#808080
35				GENERAL CEEL	5	#808080
36				BRAVO TWO	5	#808080
37				BRAVO THREE	3	#808080

Add column
Merge columns
Delete column
Clear column
Copy data to other column
Fill column with a value
Duplicate column
Create a boolean column from regex match
Create column with list of regex matching groups
Negate boolean values
Convert column to dynamic

Loading Edges

- Basically the same thing as with Nodes
- BUT:
 - Choose Append to existing workspace
 - Otherwise it will load it as a new graph, and what you want is to merge both streams of information into one network: both nodes and edges

Overview

- Let's get back to Overview
 - Appearance and Layout on the left
 - Statistics on the right
 - Graph overview in the middle
 - We'll look at all of these things in a bit
- Here you can edit your graph/network
- But first, should look something like this:

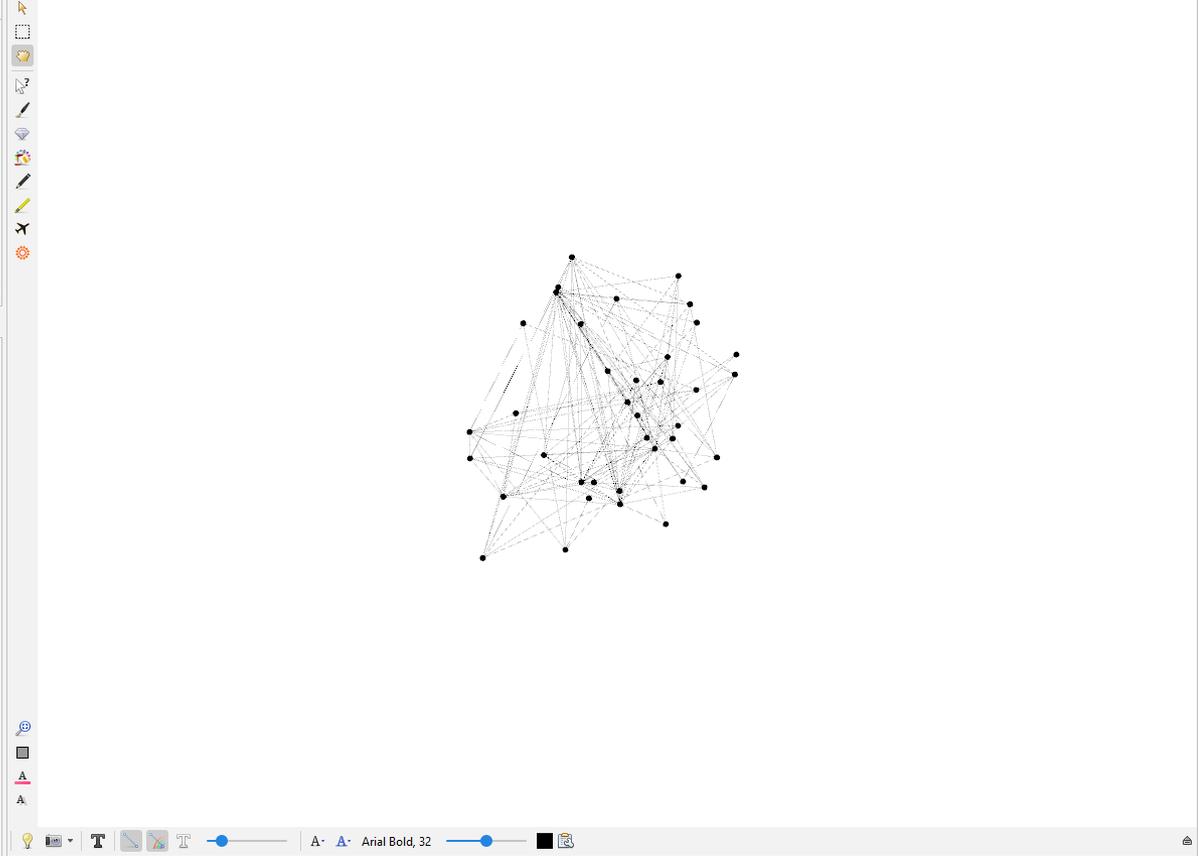
#c0c0c0

Apply

---Choose a layout

Run

<No Properties>



Nodes: 38
Edges: 135
Undirected Graph

Settings

Network Overview

- Average Degree Run
- Avg. Weighted Degree Run
- Network Diameter Run
- Graph Density Run
- HITS Run
- PageRank Run
- Connected Components Run
- Leiden algorithm Run

Community Detection

- Modularity Run
- Statistical Inference Run

Node Overview

- Avg. Clustering Coefficient Run
- Eigenvector Centrality Run

Edge Overview

- Avg. Path Length Run

Dynamic

- # Nodes Run
- # Edges Run
- Degree Run
- Clustering Coefficient Run

Preview

- Let's have a look at Preview
- Here you can render your final network visualization and export it
 - Button in the bottom left: Export: SVG/PDF/PNG
- After you click Refresh, should look something like:

Presets: Default

Settings Manage renderers

Nodes

Border Width: 1.0

Border Color: custom [0,0,0]

Opacity: 100.0

Per-Node Opacity:

Node Labels

Show Labels:

Font: Arial 12 Plain

Proportional size:

Color: custom [0,0,0]

Shorten label:

Max characters: 30

Outline size: 0.0

Outline color: custom [255,255,255]

Outline opacity: 80.0

Box:

Box color: parent

Box opacity: 100.0

Edges

Show Edges:

Thickness: 1.0

Rescale weight:

Min. rescaled weight: 0.1

Max. rescaled weight: 1.0

Color: mixed

Opacity: 100.0

Curved:

Radius: 0.0

Edge Arrows

Size: 3.0

Edge Labels

Show Labels:

Font: Arial 10 Plain

Color: original

Shorten label:

Max characters: 30

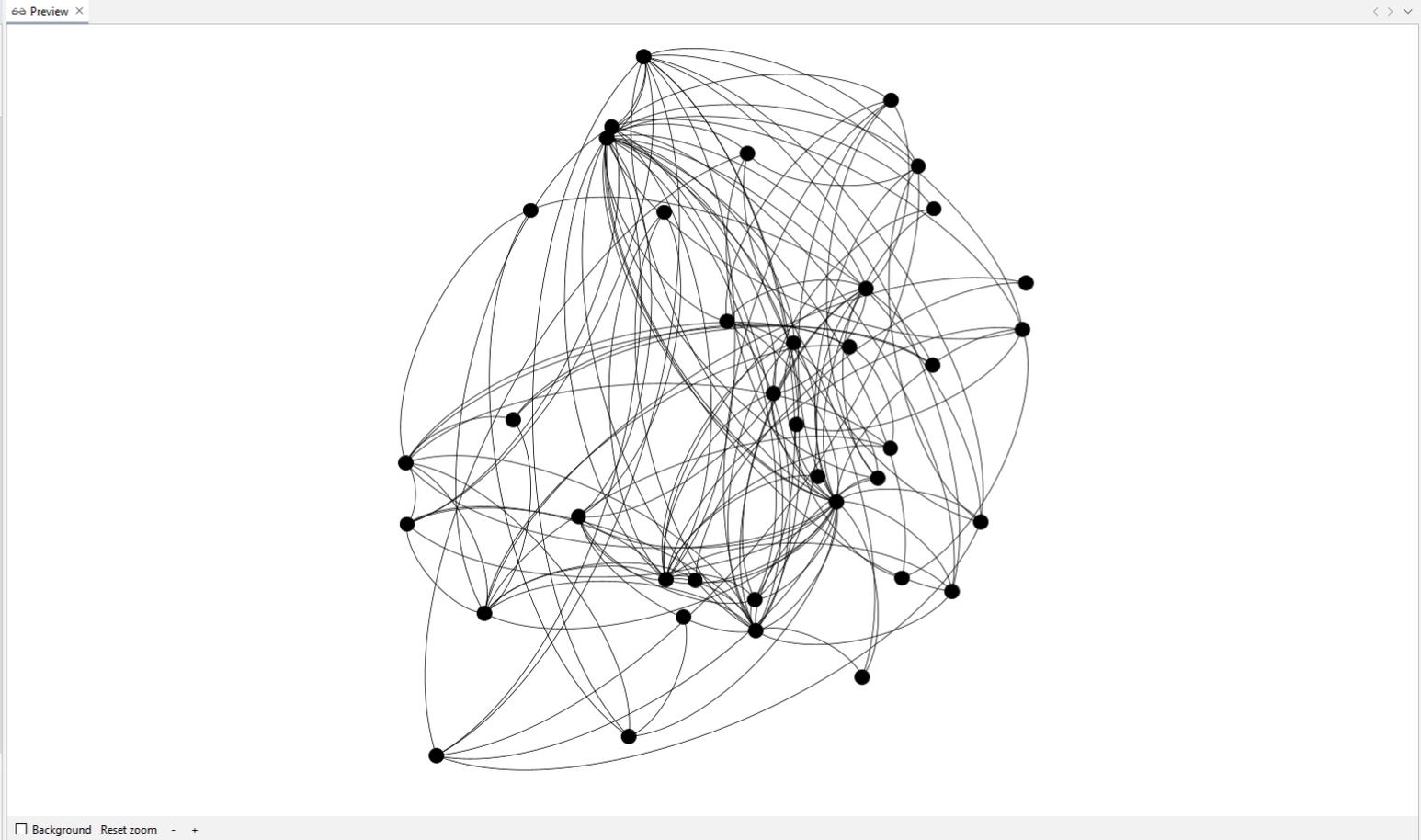
Outline size: 0.0

Outline color: custom [255,255,255]

Preview ratio: 100%

Refresh

Export: SVG/PDF/PNG



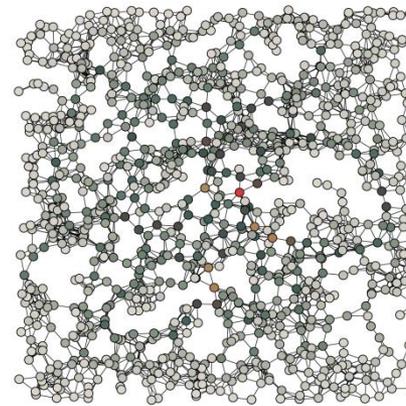
Colouring nodes

- Looks quite cool already, but let's give those nodes some colour!
- Directly left of the graph in Overview, find the Painter button in this bar: 
- Go ahead and click any node once, multiple times or hold the button!
 - Change the colour above the graph

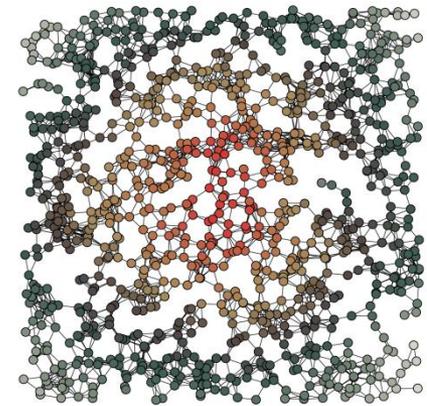


Centrality

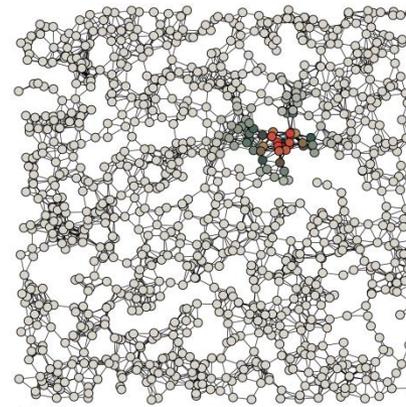
- Last week we talked about centrality
 - The “importance” of a node within a network
 - Different ways of measuring this
 - Betweenness (based on number of shortest paths running through node)
 - Closeness (based on length of all shortest paths from node to all other nodes)
 - Eigenvector (high eigenvector score means that the node is connected to many nodes who themselves have high scores)
 - Degree (number of edges incident on node)



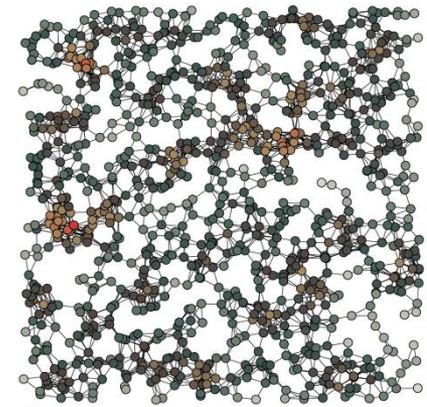
A Betweenness



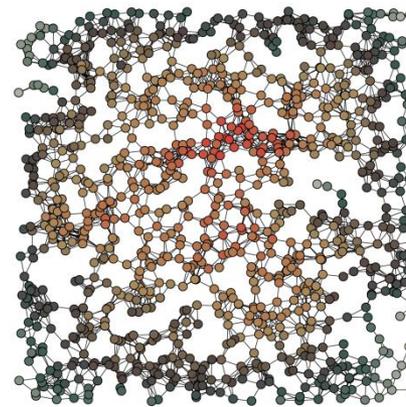
B Closeness



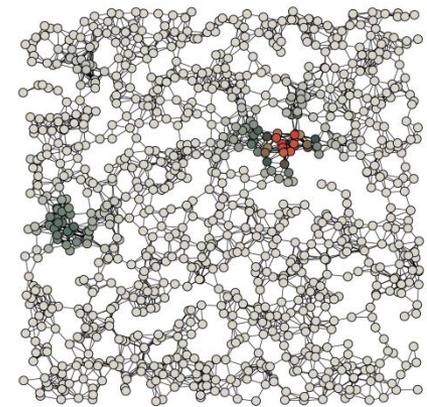
C Eigenvector



D Degree



E Harmonic



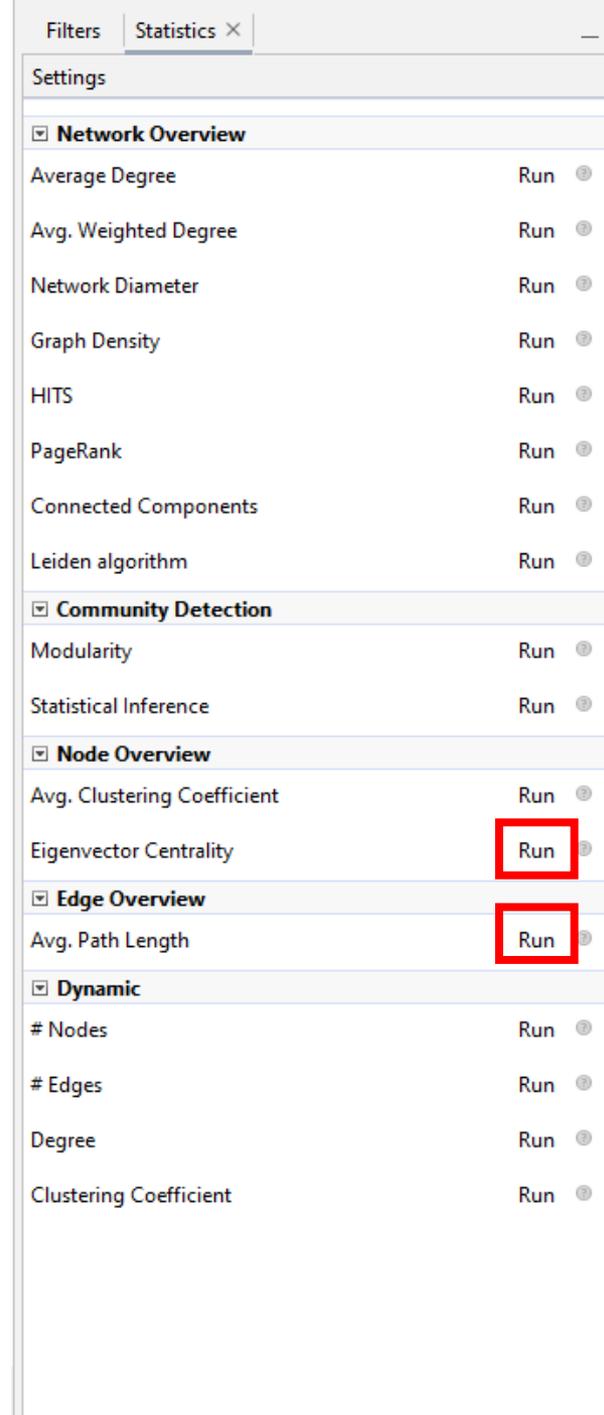
F Katz

Least central

Most central

Centrality in Gephi

- Gephi can calculate centralities for all nodes:
 - Under Statistics on the right:
 - For Eigenvector Centrality, click Run
 - For Betweenness and Closeness, click Run for Avg. Path Length
 - For Degree, no need to do anything (automatically calculated)
 - You'll get pop-ups with reports.
 - Check Data Laboratory and Data Table: calculated statistics as attributes of nodes now!

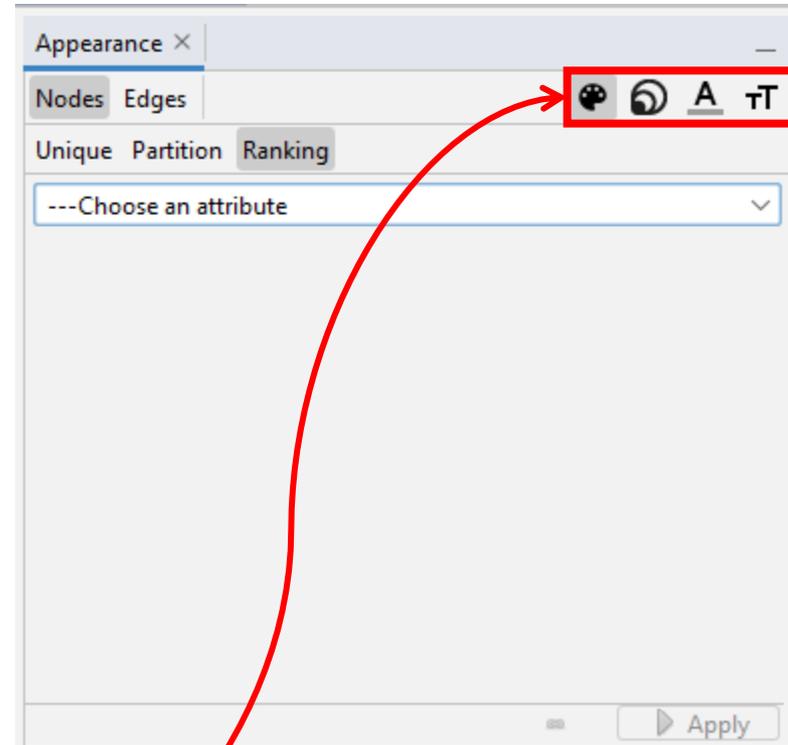


The screenshot shows the 'Statistics' panel in Gephi, which is organized into several sections. The 'Network Overview' section includes metrics like Average Degree, Avg. Weighted Degree, Network Diameter, Graph Density, HITS, PageRank, Connected Components, and Leiden algorithm. The 'Community Detection' section includes Modularity and Statistical Inference. The 'Node Overview' section includes Avg. Clustering Coefficient and Eigenvector Centrality. The 'Edge Overview' section includes Avg. Path Length. The 'Dynamic' section includes # Nodes, # Edges, Degree, and Clustering Coefficient. The 'Run' buttons for Eigenvector Centrality and Avg. Path Length are highlighted with red boxes.

Section	Metric	Action
Network Overview	Average Degree	Run
	Avg. Weighted Degree	Run
	Network Diameter	Run
	Graph Density	Run
	HITS	Run
	PageRank	Run
	Connected Components	Run
	Leiden algorithm	Run
Community Detection	Modularity	Run
	Statistical Inference	Run
Node Overview	Avg. Clustering Coefficient	Run
	Eigenvector Centrality	Run
Edge Overview	Avg. Path Length	Run
Dynamic	# Nodes	Run
	# Edges	Run
	Degree	Run
	Clustering Coefficient	Run

Colouring nodes automatically

- On the left under Appearance
 - Nodes > Ranking
 - Choose an attribute, centralities should be under it if you ran them!
 - Choose a gradient
 - Nodes > Partition
 - Give colour based on discrete category
 - Click Apply.
-
- The same holds for node size, text colour and text size



Modularity

- You can automatically detect communities/clusters in a network, and assign them a discrete label
 - Often done with Modularity
- Modularity is a measure of how well a system was broken into separate components
 - Modular building, programming
 - Language modules
 - etc.
- In networks: how well was this network broken into separate components/communities/clusters/groups?

Modularity in networks

- High modularity means there are dense connections (i.e. many edges) between nodes *within* a community, but sparse connections *between* (nodes in) other communities
- Given a partition of nodes into groups, modularity is the fraction of the edges that fall within the groups, minus the expected fraction if edges were distributed at random
 - Max 1, min $-1/2$

Modularity in other words

- Say we divide a network's nodes into multiple groups
- How much do the edges between nodes stay *within* a group?
- If the modularity is high, they stay *within* their groups very well/much
- If the modularity is low, there are many edges *between* groups
 - And then your groups make no sense, your division is not very 'modular'

Louvain Method

- Gephi uses the Louvain method to detect communities
 - Algorithm that tries to optimize the modularity of a network
 - Finds a partition of the data such that modularity is as high as possible
 - Local optimum, so slightly different answers almost every time, but very fast and rather good approximation!
- For the assignment, do some research at home into the workings of the algorithm, and explain in your own words to me how it works. It is important to know how algorithms work in order to better understand and interpret them.
- Blondel, Vincent D; Guillaume, Jean-Loup; Lambiotte, Renaud; Lefebvre, Etienne (9 October 2008). "Fast unfolding of communities in large networks". *Journal of Statistical Mechanics: Theory and Experiment*. 2008 (10): P10008. [arXiv:0803.0476](https://arxiv.org/abs/0803.0476). [Bibcode:2008JSMTE..10..008B](https://doi.org/10.1088/1742-5468/2008/10/P10008). [doi:10.1088/1742-5468/2008/10/P10008](https://doi.org/10.1088/1742-5468/2008/10/P10008). [S2CID 334423](https://pubs.aip.org/jstatmech/article/2008/10/P10008).

Modularity in Gephi

- Under Statistics, click Run for Modularity
 - Randomize improves results
 - Use weights: whether to use edge weight in the calculation. Higher weights are stronger connected edges
 - Resolution to tweak number of communities
- Result: report with number of communities found, and number of nodes per community
- Appearance > Nodes > Partition > Modularity Class

Preview

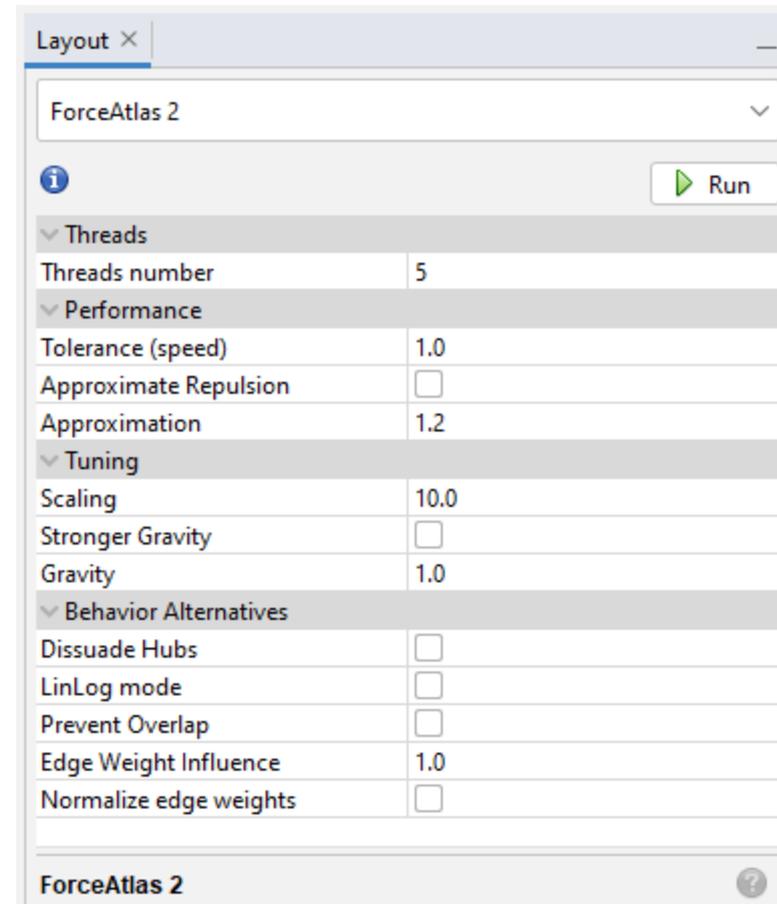
- Let's have a look at the preview now

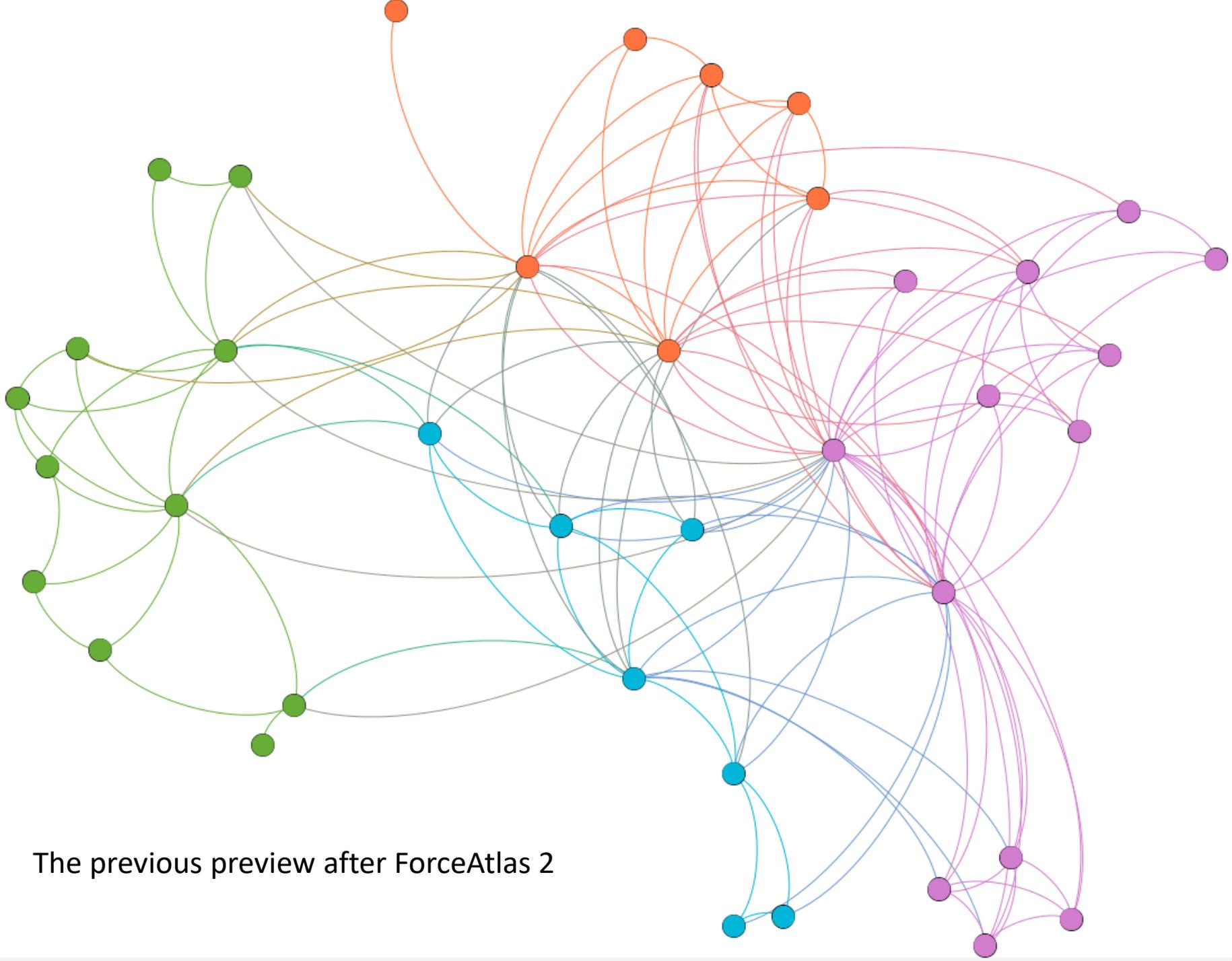
- Terribly cluttered!



Layout

- Under Layout, on the left under Overview, you can choose a layout algorithm
- Different ones. Play around!
 - Also with the parameters, to see what happens
- ForceAtlas 2 is a simple force-directed layout





The previous preview after ForceAtlas 2

Connected components

- Some Layout algorithms push nodes out of the screen
 - Possibly due to multiple connected components, that are pushed away from each other, because there is no edge to 'pull them back in'
 - A connected component in a (undirected!) graph is a set of nodes such that all nodes are reachable from every other node
- Statistics > Connected Components
 - Gives number of connected components in network
 - Can be used to colour your nodes, too.

Moving nodes

- You can of course also manually move nodes
- This can be done with this button 
- If a node (or group) is pushed away, you might want to drag them closer to the rest
- Tip: while ForceAtlas 2 is running, you can move nodes around to try and force another layout!



Deleting nodes and edges

- If one node (or edge) is an outlier or wrong, or just not wanted, you can of course delete them:
 - Right-click on the node in the graph Overview
 - Data Laboratory/Data Table > Click a node > Press the delete key
 - Outliers: for example nodes that are not connected to anything (or perhaps even those that are just VERY far away). You can use Modularity Class or Component ID for this to identify one-node classes and delete them.

Labelling nodes and edges

- Now, of course our nodes and edges have no labels
 - Below the graph in Overview, click Show Node Labels:
- Still nothing happens?
 - This is because Gephi automatically takes the value of the Label fields in the data as input for labels. Which is empty.
 - We need to tell it to take other data as label input.
 - Below, click More Settings...
 - Here you can change the background colour, some edge stuff and labels.
 - Under Labels, click Configure..., and select the attribute(s) to display as labels.



Global Edges Labels

Node Edge

Font: **Arial Bold, 32** Color: ■

Size:

Font: Arial Bold, 32 Color: ■

Size:

Size: Scaled Color: Text Hide non-selected

Configure...

Label text settings

Nodes Edges Show properties

Select attributes to display as labels

Id

Label

name

value

colour

Modularity Class

OK Cancel

Edge thickness

- Same problem holds for edge thickness
 - Edge thickness uses the attribute Weight, which is empty.
 - For now, the fact that Gephi uses Weight cannot be changed.
 - But we can copy the contents of our value attribute into the Weights column:
 - Data Laboratory > Edges > Copy data to other column > value > Weight
 - Now, the edge thickness is scaled by its weight.

But wait! Weight!

- Another result actually is that the statistics that we calculated before, did not take into account the edge weights, nor did the Layout algorithm.
 - Having the right values in the column called Weight is important for Modularity and Layout!
 - However, Weight is currently not supported for many other statistics, such as centrality and path lengths...
 - Tip: you may need to change the Scaling factor in your Layout algorithm when using Weight.

Other tools

- Do check out the following tools, too!

- Manual node sizing

- Pencils

- Shortest path

- Heat Map



All kinds of other functionalities

- I'm sure there are many functionalities in Gephi that I do not yet know!
- I highly recommend checking out some of their own tutorials: <https://gephi.org/users/>
- In fact, Gephi supports plugins to deal with functions currently not in Gephi-proper.
 - I also recommend checking those out if there is something you want to do, but Gephi won't let you.
 - <https://gephi.org/plugins/#/>

Final slide

- Good luck with the final assignment
 - When I say to give information “in a way that is detailed in such a way that I would in theory be able to roughly replicate the visualization”, this does not mean “write a tutorial”. Write academically, give me the information I need to know in order to reproduce: any parameters or settings you used (what software?), anything that isn’t “default”.
 - E.g. I can find the right button if needed.
 - You are allowed to use different software than Gephi!
- Thank you for this semester, I enjoyed it a lot!

Happy holidays! 

Final assignment

- I. Network (50%)
 - Visualize a network of Star Wars characters
 - Write a short report in which you do some network analysis
- II. Free choice (50%)
 - Self-contained visualization of your choice, any story, any data, any type of visualization
- Deadline: before 16th January 2023 9.00 AM

Final assignment

- I. Network (50%)
 - Visualize a network of Star Wars characters, from any episode or multiple
 - Data is available on the website infovis.lucdh.nl (Gabasova 2016)
 - Interactions and mentions of characters within scenes
 - Report: 500-1500 word report
 - A clear reference to the network data used
 - a discussion of all your design decisions
 - the following measures of your network:
 - a table with the ten highest ranking nodes as measured by Betweenness and Degree; and an interpretation of said measures with respect to the data
 - the number of nodes per Louvain community; and, if possible, an interpretation of the communities
 - An explanation in your own words and references to outside sources where applicable of:
 - What is the difference between Betweenness and Closeness?
 - How does Louvain Modularity work?
 - a discussion of challenges and opportunities (if any).

Final assignment

- II. Free choice (50%)
 - Self-contained visualization of your choice, any story, any data, any type of visualization
 - Can be viewed independently
 - Can be understood independently
 - Find a story that you would want to visualize
 - Suggestions of datasets on the website
 - Not necessary to create a new dataset
 - Report 1500 words max.
 - An explanation of the story you are visualizing
 - The data and design tools you used and choices you made in creating this visualization in a way that is detailed in such a way that it would in theory be able to roughly replicate the visualization (don't forget to reference where appropriate!).
 - Challenges encountered during the project and opportunities you see for this or similar information visualizations
 - A project timetable, including an overview of time spent on the project and optional self-learning
- Deadline: before **16th January 2023 9.00 AM**