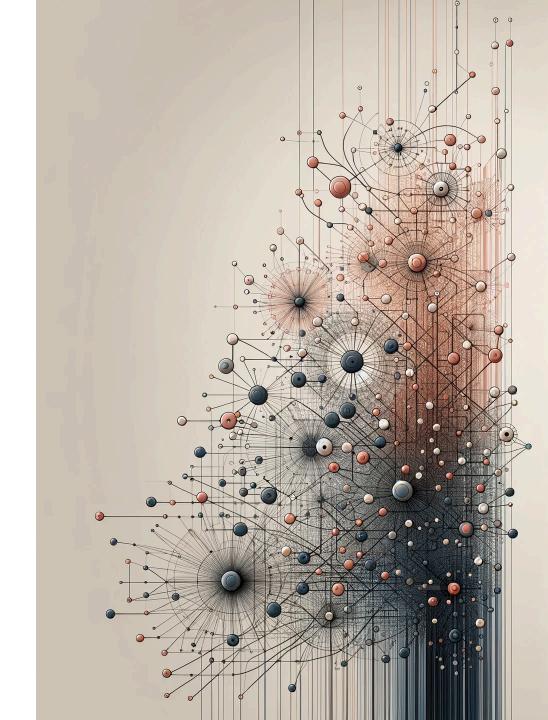


# Analisi e Visualizzazione delle Reti Complesse

**Final Project** 

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### Scope

- The objective of the final project is to let the students play with a real-world dataset applying the theoretical concepts and the practical tools we have introduced in class.
  - and perhaps exploring something new in autonomy!
- After selecting a topic and datasets, the goal is to present a narrative through quantitative exploration.
- The dataset should allow the formalization of the problem using networks.
  - o networks have to be present, however, other types such as geographical data may also be included.
  - when applicable, it is recommended to explore heterogeneous contexts.
- [9 credits] The narrative should contain a visual exploration of the domain and the results should be represented in a data visualization.
  - interactive vs static
  - same domain vs different domain



## **Organization**

- The project can be developed in **groups of maximum 3 students**.
- You have to register your project at this link to specify the group and the topic.
  - deadline: the end of the course.
- Groups and topics should not be changed after the registration.
  - of course, this could happen for many unpredicable reasons, so in this case, please, reach out and we will find an alternative solution.
- Groups and topics will be presented in the last class of the course. You will be asked to:
  - Prepare a short presentation (5min-8min) explaining the idea and the datasets you intend to use
  - Present to the class your project
  - Receive feedbacks
  - more info will be shared towards the end of the course



### What to submit

- A report describing the project and its contributions. Generally, it should contain the following sections:
  - Introduction and contextualization
    - What is your project about and why it is worth exploring it
  - Methods
    - What methods did you implement in the analys and visualization pipelines
  - Results
    - What are the main results and observations you extracted from your analysis
  - Discussion
    - Elaborate on the possible implications of your observations, or why you made some methodological choices over other available alternatives, explore alternative scenarios
  - Conclusions and extensions
    - What did you learn and how this could be extended if you have time?
- This organization is arbitrary and serves as a template to simplify your work.
  - You are free to use your own structure!
- We expect concise yet complete reports.

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### What to submit

- The **code** implementing:
  - (a) the network analysis
  - (b) the visualization
- Depending of the type of project it be in the form of:
  - a series of Jupyter notebooks
  - an interactive web app
  - o an Observable notebook
  - combinations of them
  - others
- All the material should be packed in an archive and submitted through Moodle at least 3 days before the exam session.
- The link will be active at the end of the course.



# General rule (probably the most important!)

If you have **any doubt** reach out and we can discuss alternatives that **fit best your case study and project**.



### Exam

- The exam is organized in two main parts:
  - project discussion (40%)
  - oral examination (60%)
  - o and remember the 10% bonus for the active participation in class

#### • Project discussion:

- the group/student presents the project usually with the help of a presentation
  - the presentation is not mandatory, however, it usually usueful to organize to discourse
- the goal is to show what has been done, the results, the methodology, run a demo if you created an interactive data viz and so on.
- o questions on anything related to the project, the submitted report, the code, will be asked.
- all the member of a group must discuss the project in the same session.
  - Only in specific, motivated cases we can break this rule.



### Exam

#### • Oral:

- the oral part of the exam will test your knowledge of all the concepts introduced in course.
- everything we discussed that has not be marked as optional is a potential candidate for a question.
- o it is possible that a question involves the solution of a **simple exercise** involving theory constructs.
  - a theory question could be practical, e.g., given this networks, compute the betweenness centrality of the nodes
- each student in a group will be evaluated separately
  - you should expect around 3 questions per candidate
  - this is just an **estimate**, there will be variability



## What you can focus on?

- Generic description of the network. Calculate structural measures and plot them whenever it is possible/significant:
  - Distances: average, distribution
  - Degree: average, variance/standard deviation, degree distribution (some fit? Does it follow a power law? If yes, is
    it in the scale-free regime?)
  - Clustering coefficient
  - Largest connected component size
  - Degree correlation: neutral, assortative, disassortative?
  - Are there communities? Can you properly show them with an appropriate layout? Can you discuss them?
  - Centralities
  - Can you analyze homophily?
- Try to interpret the results of these measures, and comment/discuss results.

Final project

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## What can you focus on?

- Dynamics:
- Once you have studied your network, and you have a general understanding of its structure, you can use it to simulate some dynamic processes, e.g.:
  - Behavioral cascades
  - Diffusion of innovations
  - Epidemics
  - o ...
- What could you expect to happen over that network when some of these models is simulated?



## What can you focus on?

- Generative models:
  - You might need to create your own artificial random networks for comparison purposes
  - Erdos-Renyi
  - Watts-Strogatz (small-world)
  - Configuration model (degree preserving)
  - Barabasi-Albert (preferential attachment)
  - Stochastic block model
  - others
- You can use different generative models, to produce comparisons, varying some parameters (e.g., linking probability, number of edges added at each step, degree distributions, and so on)
  - For some comparisons, you may need to preserve some characteristics (e.g., degree distribution). Try to rewire properly your network in order to shuffle your data.
- You can perform on such synthetic networks the analysis that has been proposed in the previous slides, to detect differences
- Try to explain different behaviors



### **Datasets**

- Stanford Large Network Dataset Collection
- The KONECT project
- More into the data visualization side:
  - Awesome public datasets
  - Kaggle datasets
  - FiveThirtyEight Datasets
  - data.gov
  - AWS Public Data Sets
  - r/datasets
  - Google BigQuery Public Datasets



# **Ispiration for projects**

- MIT course on Networks (2018)
- Network Science course Ilya Makarov (2020)
- More on the data viz side but still useful YY Ahn (2023)



# **Examples**

Organizational / Social	Enron Email (~34k / 180k)	Rich temporal corporate comms; used in network-analysis seminars
Online Social	Facebook New-Orleans (63 k / 817 k)	Classic friend graph; community & hub structure
Biological	Yeast PPI (~6k/90k)	Scale-free interactome; centrality-lethality studies
Infrastructure	US Western Power Grid (4.9k/6.6k)	Small-world grid; resilience analysis
Citation	arXiv HEP-TH Citations (27 k / 352 k)	Directional growth; influence over a decade
Transportation	Global Airline Routes (OpenFlights) (2.9k/30k)	Hub-and-spoke pattern; robustness to hub loss



### Project Example 1 – Enron Email

#### **Research question**

Who were the key actors in Enron's communication network and how did their roles shift during the 2001 crisis?

#### Narrative hooks

"Rising and falling power brokers" inside a collapsing firm.

### Key steps / metrics

- 1. Build monthly snapshots → **degree & betweenness** trends
- 2. Community detection (Louvain) to reveal departments
- 3. Compare pre- vs post-crisis density & centrality
- 4. Visualize ego-networks of top executives

### Story payoff

Show how hubs fragment and new brokers emerge as the scandal unfolds.



### Project Example 2 – Yeast PPI Network

#### **Research question**

Do highly connected proteins ( hubs) correspond to genes essential for cell survival?

#### Narrative hooks

"Life's linchpins" – when a hub fails, the cell dies.

### Key steps / metrics

- 1. Compute degree centrality; rank top 5% proteins
- 2. Cross-reference with essential-gene database
- 3. **Community detection** → functional modules
- 4. Contrast with a degree-preserving randomized network

### Story payoff

Quantitatively confirm the centrality-lethality rule; map hubs to biological functions.



### Project Example 3 – Global Airline Network

#### **Research question**

Which airports are critical hubs, and how does their loss affect global connectivity?

#### Narrative hooks

"What if Heathrow grounded all flights tomorrow?"

### Key steps / metrics

- 1. Degree & betweenness to list top hubs
- 2. Remove top-N hubs → measure drop in **largest component size** & **avg. path length**
- 3. Visualize community structure (geographical clusters)
- 4. Optional: simulate rerouting strategies for resilience

### Story payoff

Reveals vulnerability of a hub-and-spoke world and highlights hidden choke-points like DXB.



