

# Combinatorial Network Analysis - Introduction

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- Example 1. The world wide web is a network: the elements are the web pages and the connections are the hyperlinks that point from one web page to another.
- Example 2. The network made by the behaviour of the reindeer in a herd in a given day. Each reindeer is an actor, and we place a weighted interaction between any two reindeer: the weight is  $n$  if they come closer than a given threshold (say, 1 meter)  $n$  times in a day.

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- Example of question addressed by network science: which elements of the network are the most important?
- Example of question addressed by network science: are there any naturally identified subnetworks that emerge from the main network?

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- **Mathematical** issues – it should be complex enough to capture as much as possible of the reality, but also simple enough that mathematicians can do something with it;
- **Computational** issues – real-life networks are often huge; they may evolve with time; practitioners may want very quick answers on them.

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- **Edges = abstract connections.** Information spreading among a group of people; airports linked by airline routes.

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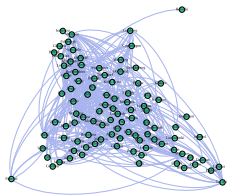
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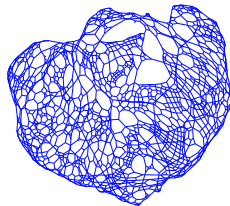
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- **Edges = other kinds of relations.** Exchange of goods/services in an economic network; correlation between stocks in the market exchange.

# Some real-world examples



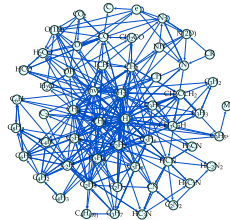
(a)



(b)



(c)



(d)