# Statistical Analysis of Networks

## Lecture 3 – Basic concepts

## NETWORK ANALYSIS: TYPE OF RELATIONS

#### Relations – measurement level:

- binary (dichotomous): relation is present or absent
- weighted (valued): a (numerical) value attached to the edge indicating its 'strenght' (intensity, frequency)
- signed: positive (+) and negative (-) signs attached to the edge

Measurement level can be combined with the type of relations: different types of network

 additional data can be available on nodes (node' s attributes) and/or eventually on edges/arcs (edges' attributes)

## TYPE OF NETWORKS/GRAPHS:



- (a) unweighted, undirected
- (b) discrete vertex and edge types, undirected
- (c) varying vertex and edge weights, undirected
- (d) directed
- (e) signed

## EXAMPLE: MIXED GRAPH



- Unit, actor, node, vertex –
  a, b, ..., k
- Tie, link:
  - □ arc = directed link/edge, (*a*, *d*)
    - intkieuge, (a, u)
      - a initial node
      - d terminal node
  - link/edge, (c: d)

(*i*,*i*) relations (self-relations or loops) usually not considered/defined

## EXAMPLE: FRIENDSHIP NOMINATION

E.g., answers to questions: who do you consider a friend?



- one-mode
- binary
- directed
- small
- no-loops

directed graph: also called DIGRAPH

## EXAMPLE: INTERACTION NETWORK

E.g., number of times observed kids (in kindergarden) playing together?



- one-mode
- valued/weighted
- undirected
- small
- no-loops

#### WEIGHTED GRAPH

## EXAMPLE: FOOTBALL PASSING NETWORKS



7 - Ribery, 33 - Gómez, 10 - Robben, 31 - Schweinsteiger, 25 - Müller, 8 - Martínez, 27 - Alaba, 4 - Dante, 17 - Boateng, 21 - Lahm, 1 - Neuer



9 - Alexis, 10 - Messi, 17 - Pedro, 8 - Iniesta, 16 - Busquets, 6 - Xavi, 18 - Alba, 3 - Piqué, 15 -Bartra, 2 - Alves, 1 - Valdés

#### one-mode

- valued
- small
- no-loops
- directed

#### WEIGHTED DIGRAPH

(https://grafos-da-bola.netlify.app/)

## EXAMPLE: TRANSPORT NETWORK

#### E.g., USA air roots



- one-mode
- valued (distance), but plotted as binary (values determines the layout)
- medium
- no-loops
- undirected

WEIGHTED (DISTANCE) GRAPH

#### EXAMPLE OF LARGE NETWORK: SLOVENIAN TWITTER NETWORK



## EXAMPLE: CITATION NETWORK (DAG)



Figure 6.3: A directed acyclic network. In this network the nodes are laid out in such a way that all edges point downward. Networks that can be laid out in this way are called acyclic, since they possess no closed cycles of edges. A real-life example of an acyclic network is a network of citations between papers, in which the vertical axis would represent date of publication, running up the figure, and all citations would necessarily point from later papers to earlier ones.

Newman M. (2018) *Networks*, Oxford, University Press, 2nd Edition

- one-mode
- binary
- directed (acyclic)

## DIRECTED ACYCLIC GRAPH - DAG

DAG: A <u>directed</u> network with no cycles (all distinct nodes following directed edges)

DAG is very useful in representing a clear dependency structure between the nodes



## GRAPH: BASIC SUBNETWORKS



#### DYADIC AND TRIADIC CONFIGURATION - UNDIRECTED GRAPH



The presence of 'small' network patterns reflects the underlyng structural processes in the network

## TRIANGLE – DIRECTED GRAPH



Cyclic triad: arcs follow the same direction



Transitive triad: not all arcs follow the same direction

The presence of 'small' network patterns reflects the underlyng structural processes in the network

#### DYADIC AND TRIADIC CONFIGURATION - DIRECTED GRAPH



16-300

## 16 TRIADIC CONFIGURATION – DIRECTED GRAPH

M-A-N labeling convention: Mutual Asymmetric Null

the **first** character gives the number of mutual dyads,

the **second** character gives the number of asymmetric dyads,

the **third** character gives the number of null dyads

the **letter** (if present) stands for **D**own, **U**p, **T**ransitive, **C**ycle

