## BIG DATA STATISTICS FOR BUSINESS

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## Introduction

- The basic idea of a social network is very simple.
- A social network is a set of actors (or points, or nodes, or vertices) that may have relationships (or edges, or ties) with one another.
- Networks can have few or many actors, and one or more kinds of relations between pairs of actors (e.g. students in a classroom might like or dislike each other, they might play together or not, they might share food or not, ecc.).
- Network data are defined by actors and by relations (or nodes and ties, etc.).
- Network analysis focuses on the relations among actors.


## Graphical techniques

- For the calculation of indexes describing networks, it is most useful to record information as matrices.
- For visualizing patterns, graphs are often useful.
- One reason for using mathematical and graphical techniques in social network analysis is to represent the descriptions of networks compactly and systematically.

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## Network data

- «Conventional» data consists of a rectangular matrix.
- The rows of the array are the cases, or subjects, or observations. The columns consist of (numerical or categorical) variables.
- «Network» data (in their purest form) consist of a square matrix of measurements.
- The rows of the matrix are the subjects (or actors or observations).
- The columns of the matrix are the same set of subjects.
- Each cell of the matrix describes a relationship between the subjects.


## Network data

- The major difference between conventional and network data is that conventional data focuses on actors and variables, while network data focuses on actors and relations.

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## Example

- Suppose we were describing the structure of close friendship in a group of four people: Bob, Carol, Ted, and Alice.
- We could describe this pattern of liking ties with an actor-byactor matrix where the rows represent choices by each actor (network matrix).
- We will put in a "1" if an actor likes another and a "0" if he doesn't.


## Example

|  | Bob | Carol | Ted | Alice |
| :--- | :---: | :---: | :---: | :---: | :---: |
| Bob | --- | 1 | 1 | 0 |
| Carol | 0 | -- | 1 | 0 |
| Ted | 1 | 1 | --- | 1 |
| Alice | 0 | 0 | 1 | --- |

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## Graphs

- Network analysis uses (primarily) one kind of graphic display that consists of points (or nodes) to represent actors and lines (or edges) to represent ties or relations.
- These graphic displays are known as «undirected graphs» (undirected network) or «directed graphs» (directed network) according to the indication of the relations.


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|  | Bob | Carol | Ted | Alice |
| :--- | :---: | :---: | :---: | :---: | :---: |
| Bob | --- | 1 | 1 | 0 |
| Carol | 0 | -- | 1 | 0 |
| Ted | 1 | 1 | --- | 1 |
| Alice | 0 | 0 | 1 | --- |



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|  | Bob | Carol | Ted | Alice |
| :--- | :---: | :---: | :---: | :---: |
| Bob | --- | 1 | 1 | 0 |
| Carol | 0 | -- | 1 | 0 |
| Ted | 1 | 1 | --- | 1 |
| Alice | 0 | 0 | 1 | --- |

## Directed network



## Popularity of the nodes

- If we sum the elements of the column vectors in this example, I would be measuring how "popular" each node was (in terms of how often they were the target of a directed friendship tie).

|  | Bob | Carol | Ted | Alice |
| :--- | :---: | :---: | :---: | :---: | :---: |
| Bob | --- | 1 | 1 | 0 |
| Carol | 0 | -- | 1 | 0 |
| Ted | 1 | 1 | --- | 1 |
| Alice | 0 | 0 | 1 | --- |

## Rearranging the matrix

- It is also helpful, sometimes, to rearrange the rows and columns of a matrix so that we can see patterns more clearly.
- Let's rearrange (permute) the matrix so that the two males and the two females are adjacent in the matrix.


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- If we calculate the proportion of all ties within a block that are present, we can create a block density matrix.

|  | Male | Female |
| :--- | :--- | :--- |
| Male | 1.00 | 0.75 |
| Female | 0.50 | 0.00 |

## Network measures <br> Degree

- In a network analysis, the degree of a node is the number of all its connections.



## Network measures <br> Degree

- In directed network, we can distinguish between in-degree and out-degree: in-degree is a count of the number of ties directed to the node, and out-degree is the number of ties that the node directs to others.



## Network measures

## Diameter

- In network analysis the diameter of a network is the shortest distance between the two most distant nodes in the network.
- In other words, once the shortest path length from every node to all other nodes is calculated, the diameter is the longest of all the calculated path lengths.



## Network measures

## Average distance

- In network analysis the average distance calculates the average path length in a graph, by calculating the shortest paths between all pairs of vertices.



## Network measures Density

- In network analysis the density is the ratio of the realized edges and the possible edges.



## Network measures Closeness

- In network analysis with N nodes, closeness centrality (or closeness) of a node is a measure of centrality, calculated as ( $\mathrm{N}-1$ ) divided by the sum of the length of the shortest paths between the node and all other nodes in the graph.
- Thus, the more central a node is, the closer it is to all other nodes.



## Betweenness

- In network analysis, betweenness centrality (or betweenness) of each node is how often a node is a bridge between other nodes.



## Weighted network

- A weighted network is a network with weighted edges.
- Edge weights are often crucial for network analysis and modeling, and many data sets include edge weights. They often represent the strength of a connection, or distance, or some other quantity.
- In many real-world networks, we can observe that not all ties in a network have the same capacity (in terms of their intensity, or capacity).


## Weighted network

- For example, in social networks, some contacts are friends, whereas others are simply acquaintances.
- Granovetter (1973) argued that the strength of a social tie is a function of its duration, emotional intensity, intimacy, and exchange of services.
- In information networks, variations in the strength of a tie might depend on the flow of information.
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