



# CS343 Graph Data Science

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Introduction

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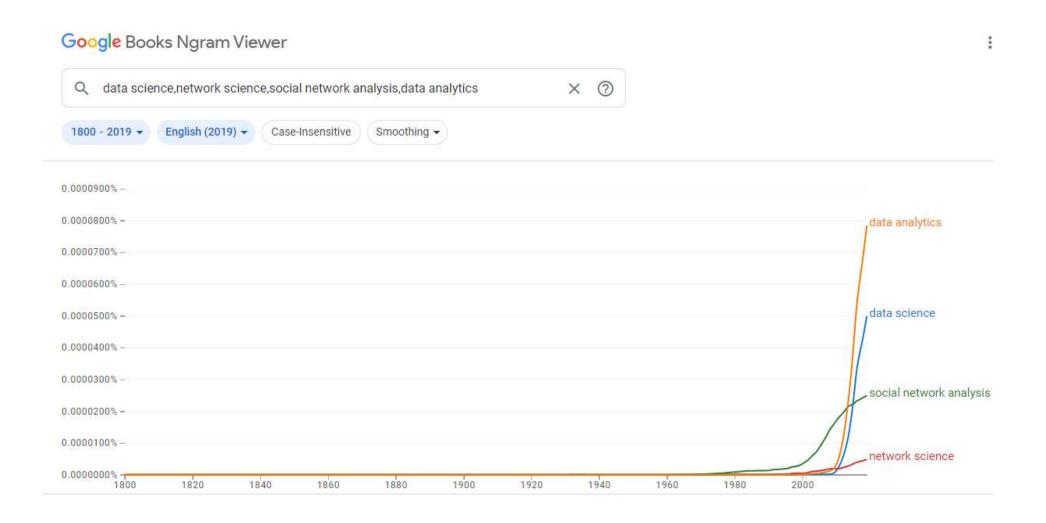
### **Greater Data Science**

David Leigh Donho, professor of statistics at Stanford, defined following activities as part of Data Science in his paper "50 Years of Data Science", published in 2015

- Data Exploration and Preparation
- Data Representation and Transformation
- Computing with Data (Automation)
- Data Visualization and Presentation
- Data Modelling
  - Generative Modelling
  - Predictive Modelling
- Science About Data Science



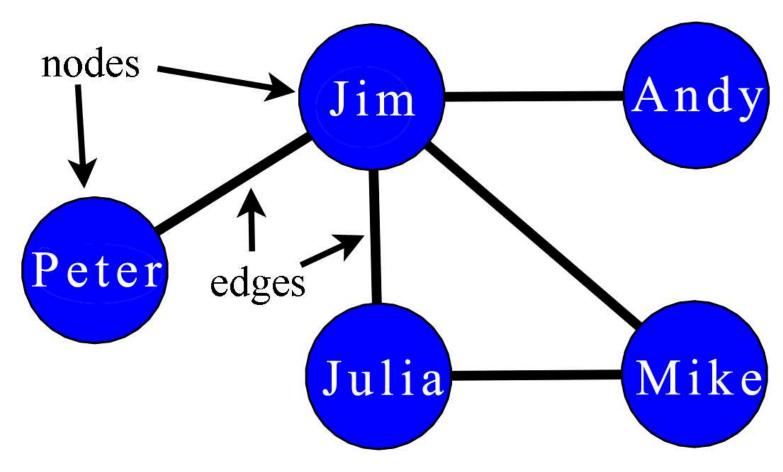
### **Evolution of Network Science**



### What is a network?

- A network is an abstract representation to model pairwise relations between objects from a certain collection.
- A network can be of tangible objects
- also possible to define a network of entities that defined in abstract space

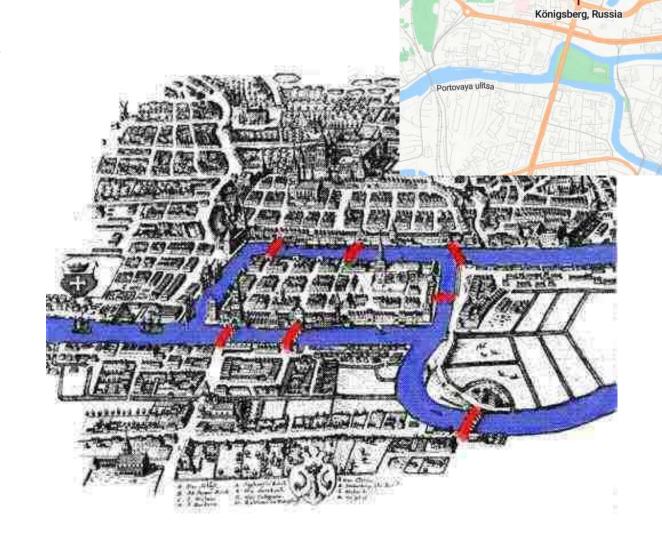
### A Network?



**Mathematical Structure called Graph** 

Konigsberg (Kaliningrad, Russia) bridge problem

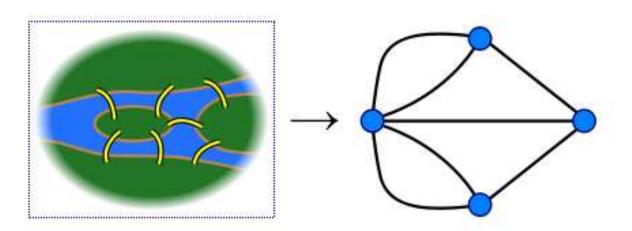
- if the seven bridges of the city of Königsberg over the river Preger
- can all be traversed in a single trip without doubling back?
- additional requirement that the trip ends in the same place it began
- Give birth to graph theory



Kaliningrad

# Solution as graph!

- Swiss mathematician Leonhard Euler
- considering each piece of island as dot
- each bridge connecting two island as a line between two dots
- a graph of dots (vertices or nodes) and lines (edges or links).



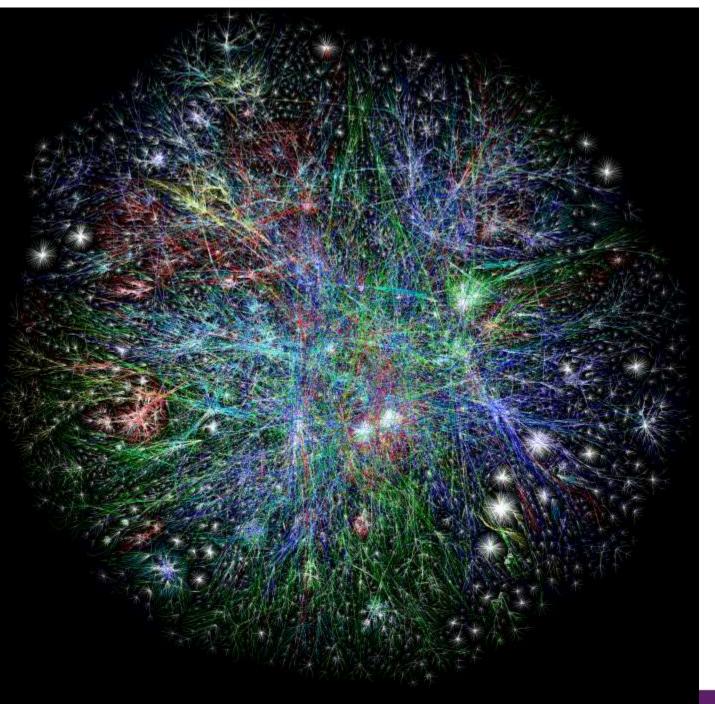
What else can we represent using Graphs?

### Co-Authorship

# review articles, by M. Newman (SIAM Review 2003) and by S. Boccaletti *et al.* (*Physics Reports* 2006). Vertices represent scientists whose names appear as authors of papers in those bib-liographies and an edge joins any two whose names appear on the same paper. A small number of other references were added by hand to bring the network up to date. This figure shows the largest component of the resulting network, which contains 379 individuals. Sizes of vertices are proportional to their so-called "community centrality." Colors represent vertex degrees with redder vertices having higher

#### Collaborations Between Network Scientists

This figure shows a network of collaborations between scientists working on networks. It was compiled from the bibliographies of two



Internet Routing Paths

5 million edges

Graph Colors:
Asia Pacific - Red
Europe/Middle
East/Central
Asia/Africa - Green
North America Blue

Latin American and Caribbean - Yellow RFC1918 IP Addresses - Cyan

Unknown - White

http://www.opte.org/maps/

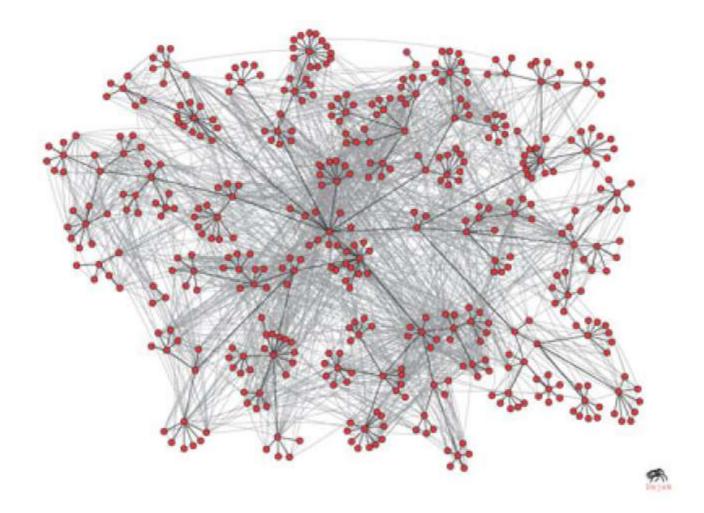
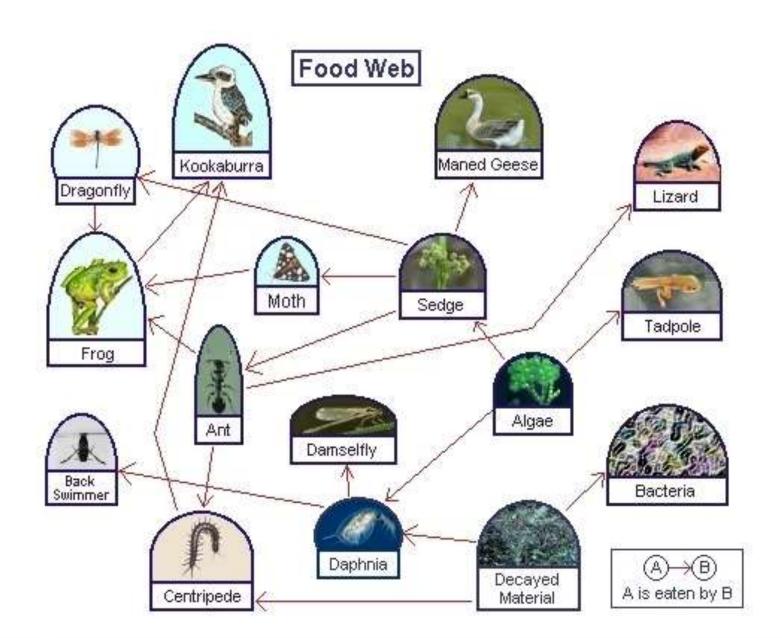
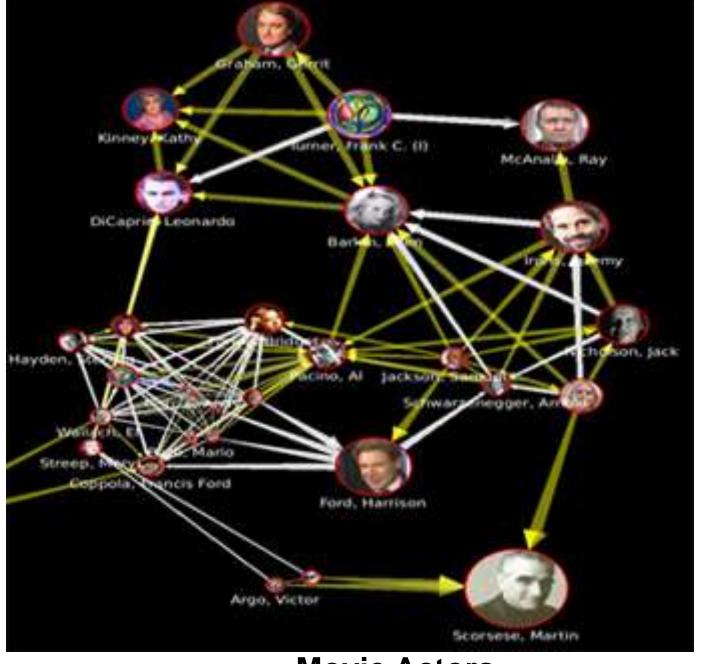


Figure 1.2: Social networks based on communication and interaction can also be constructed from the traces left by on-line data. In this case, the pattern of e-mail communication among 436 employees of Hewlett Packard Research Lab is superimposed on the official organizational hierarchy [6]. (Image from http://www-personal.umich.edu/ladamic/img/hplabsemailhierarchy.jpg)



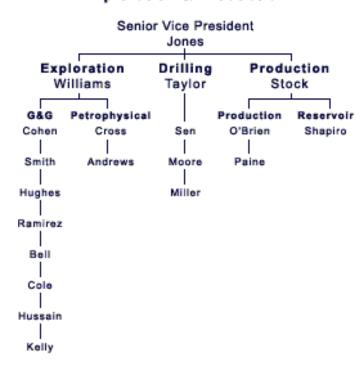


**Movie Actors** 

# \*Case Study - Network in Organization

- Consider the given Organogram of an organization
- What information can we extract from this?

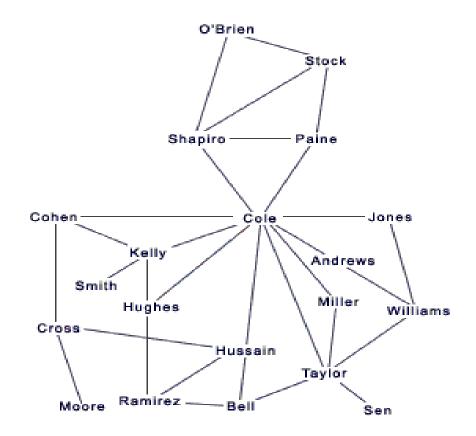
#### **Exploration & Production**



Source: http://www.robcross.org/network\_ona.htm

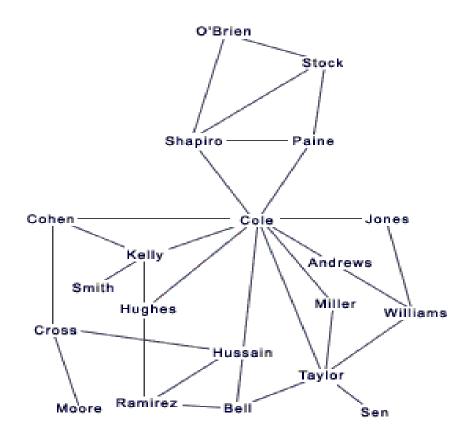
# Case Study - Network in Organization

- Consider this informal network
- How did we come up with this network?

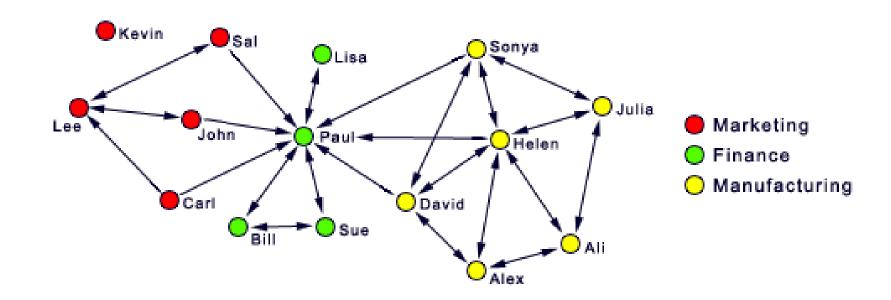


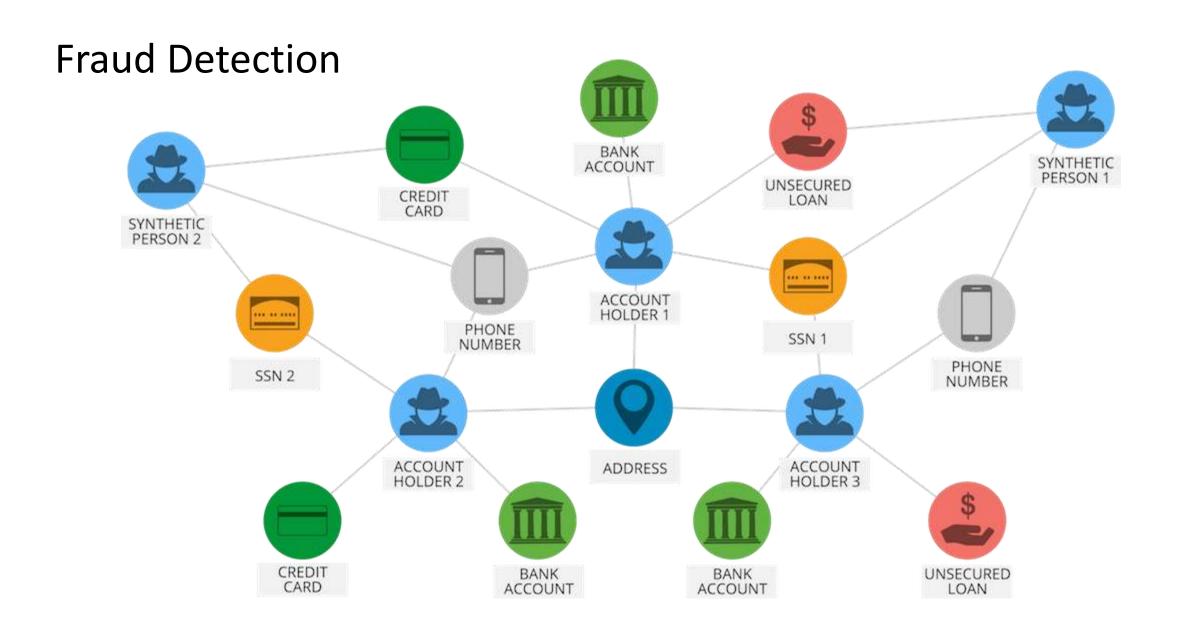
# Case Study - Network in Organization

- Consider this informal network
- How did we come up with this network?
- Each edge represents communication link between two people
- What information can we extract from this network?

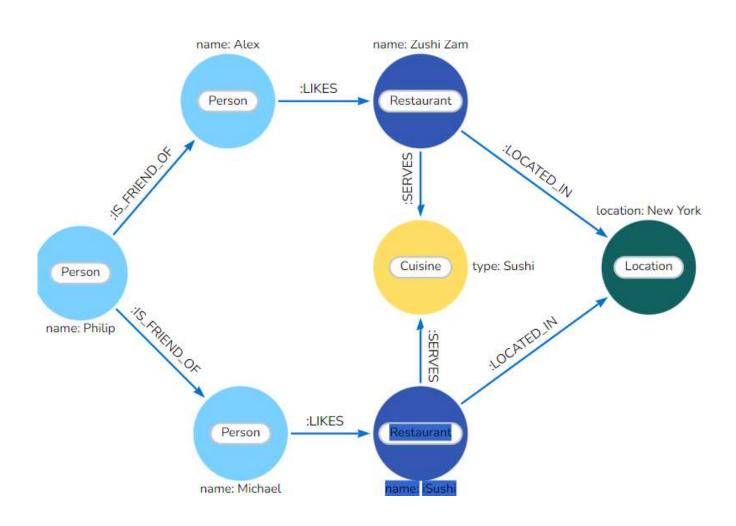


# Case Study – Network in Organization





### **Product Recommendation**

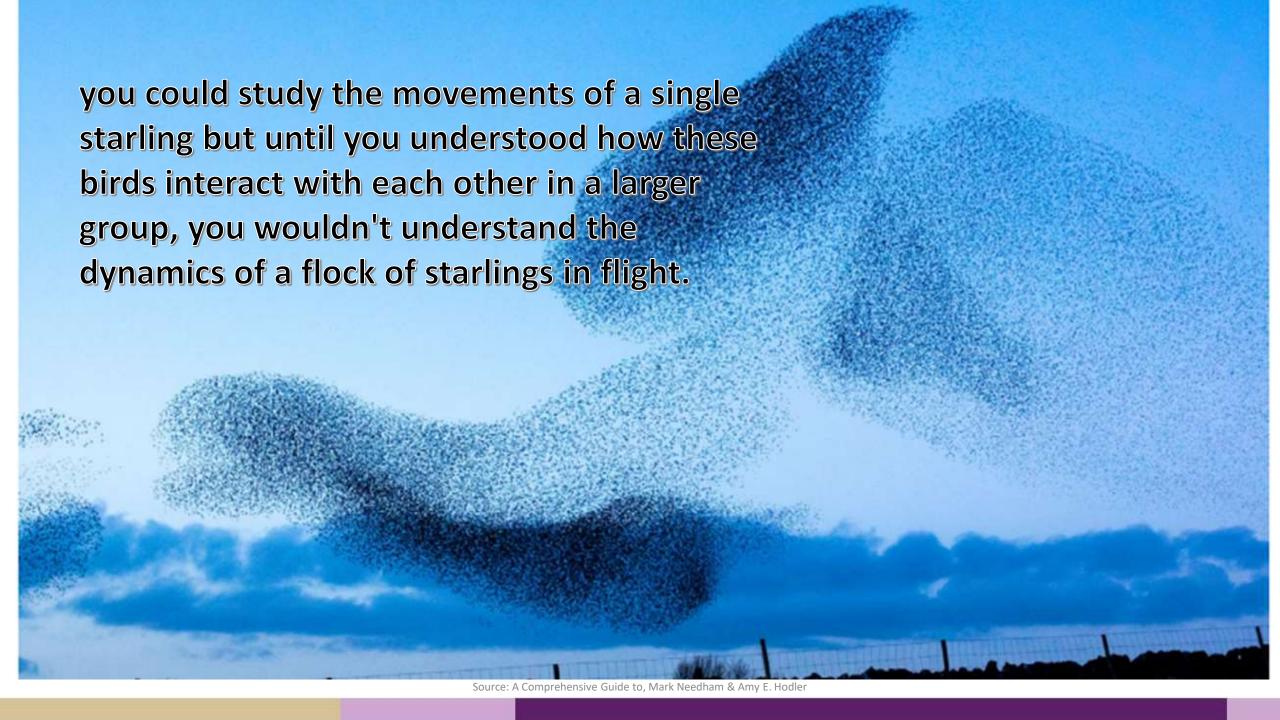


### **Graph Shaped Problems**

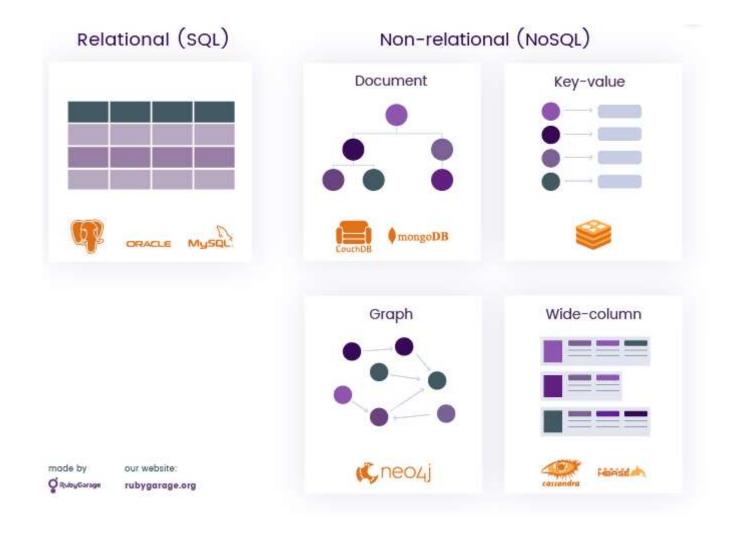
- Pair wise relationship
- Self-relationship
- Path discovery
- Finding In-direct/hidden relation

### Connectedness of Data

- Big Data is used to define with five or six Vs:
  - Volume
  - Velocity
  - Variety
  - Veracity
  - Value
- Valence: tendency of individual data to connect and overall connectedness
  - Chemistry: combining power of an element
  - Psychology: intrinsic attractiveness of an object
  - Linguistics: number of elements a word combines



## Database Systems



### Naïve Graph Databases

- Graph databases can be in two forms
  - Layer over SQL
  - Implemented as Graph
- Naïve: implemented as Graph
  - Index-free adjacency: traverse relationship without using indexes
  - Local performance: Graph size does not affect the performance
  - In RDBMS: Joins is the major cause of performance issues