

# Graph Data

Data as objects & connections between objects

$t$ instances nodes vertices	$\uparrow$ Relationships links edges
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Eg:-

- social network
- web pages
- biological networks
- relationships between things : numerical, categorical, timeseries

Graph  $G = (V, E)$

w/  $V$  is vertex set

$E \subseteq V \times V$  edge set

$e \in E$  as unordered pairs (e.g. undirected graph)

or as ordered pairs (e.g. directed graph, digraph)

directed edge  $(v_i, v_j)$

$v_i$  is the tail

$v_j$  is the head



$(v_i, v_i)$  is loop

Undirected graph w/o loop is simple

Let  $e = (v_i, v_j)$  edge is incident w/  $v_i$  and  $v_j$   
and  $v_i$  and  $v_j$  are neighbors

$|V| = n$  is the order of graph

$|E| = m$  is the size of graph

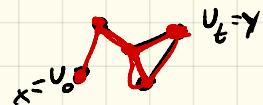
A weighted graph each edge  $(v_i, v_j)$  has weight  $w_{ij} \in \mathbb{R}$

## Paths & Pst

A walk in a graph  $G$  between nodes  $x, y$   
ordered seq of verts

$$x = v_0, v_1, v_2, \dots, v_{t-1}, v_t = y$$

$$\text{s.t } (v_i, v_{i+1}) \in E \quad i = 0, \dots, t-1$$



length of walk  $t$  # of edges in walk

$$x = v_0 \overset{1}{\nearrow} v_1 \overset{2}{\searrow} v_2 = y \quad \text{len 2}$$

walk is closed  $x = y$



trail walk w/ distinct edges

path walk w/ distinct vert (except  $x, y$ )

Cycle closed path w/ length  $t \geq 3$

~~not a cycle~~

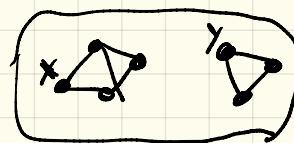
Shortest path between  $x, y \in V$

is a path w/ min length

length of the shortest path is the distance  
between  $x, y$  written as  $d(x, y)$

$d(x, y) = \infty$  if there is  
no path

cycle



Two nodes  $x, y$  are connected  
if  $\exists$  a path between  $x$  and  $y$

Graph is connected  
if  $v_i$  is connected to  $v_j$  &  $v_i, v_j \in V$

A **connected component** (component for short)  
is a maximal connected subgraph

- 1 connected component  $\Rightarrow$  graph is connected
- 2 or more connected components  $\Rightarrow$  graph is disconnected

Adj matrix

Let  $G = (V, E)$  be a graph  
 $|V| = n$  called

write  $G$  as  $n \times n$  matrix **adjacency matrix**

$$A(i, j) = \begin{cases} 1 & \text{if } (v_i, v_j) \in E \\ 0 & \text{otherwise} \end{cases}$$

- $G$  undirected  $\Rightarrow A$  is sym  
 $G$  directed  $\Rightarrow A$  may not be sym

Weighted adj matrix

$$A(i, j) = \begin{cases} w_{ij} & \text{if } (v_i, v_j) \in E \\ 0 & \text{otherwise} \end{cases}$$

turn back into binary matrix using threshold

$$\wedge A(i, j) = \begin{cases} 1 & w_{ij} \geq t \\ 0 & \text{otherwise} \end{cases}$$

Graph from point data

data set  $D$   $n$  points in  $\mathbb{R}^d$

turn into a graph

each  $\vec{x}_i \in D \rightarrow v_i \in V$

$\vec{x}_i, \vec{x}_j \in D \rightarrow (v_i, v_j) \in E$

w/ weight  $w_{i,j} = \text{Sim}(\vec{x}_i, \vec{x}_j)$

optionally

sparsify graph w/ threshold

↑ using dist  
or other  
sim

Degree

degree of vertex  $v_i$  (local)

# of neighbors

more generally  $d_i = \sum_{j=1}^n A(i,j)$

average degree (global)

$$M_d = \frac{1}{n} \sum_i d_i$$