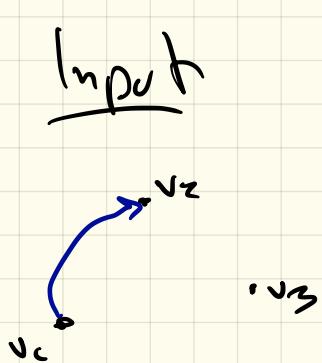


L25 - Communities

+ Influencers in Graphs.



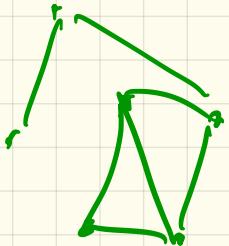
$G : (V, E)$
social network

$V = \text{people (entities)}$
 $E = \text{connections}$

Large Graphs

$|V| = \text{ (billion)}$

(facebook)
twitter



generally (for public) not
fully available.

20 years ago

- Math World

Not real world
 $G(n,p)$ = n nodes
 $G(n,p)$ = n nodes
each edge (i,j) exist w.p. p.

- Sociology

- Karate Club
~30 nodes

- High School

$|V| = 200$

+ usually drawn

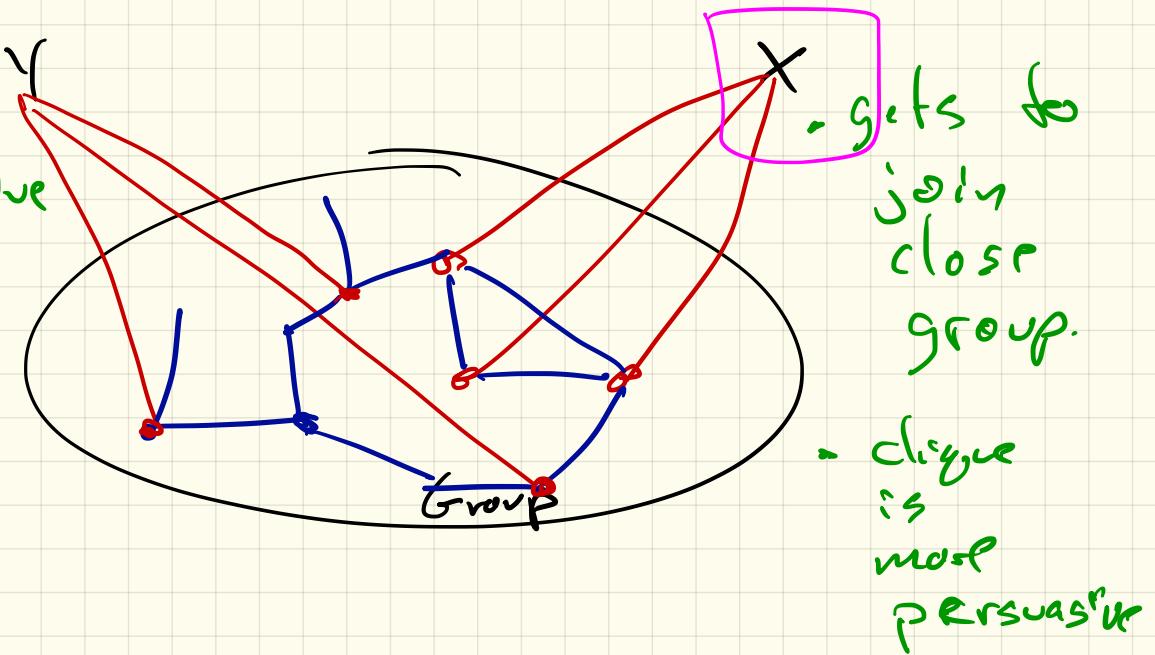
+ small

clique

Why Do People Join Groups?

3 friends in group

- broader perspective
- independent support

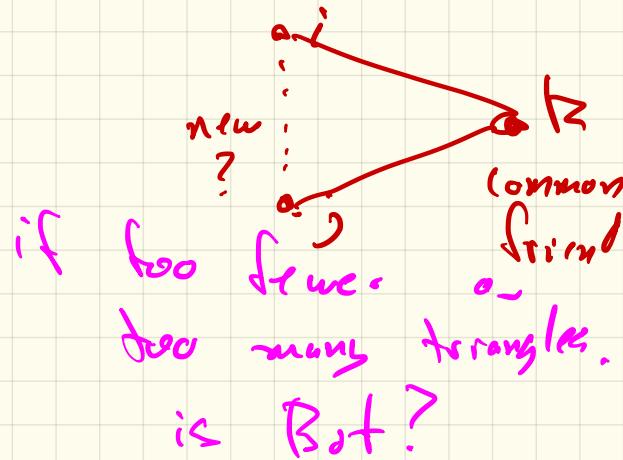


Preferential Attachment

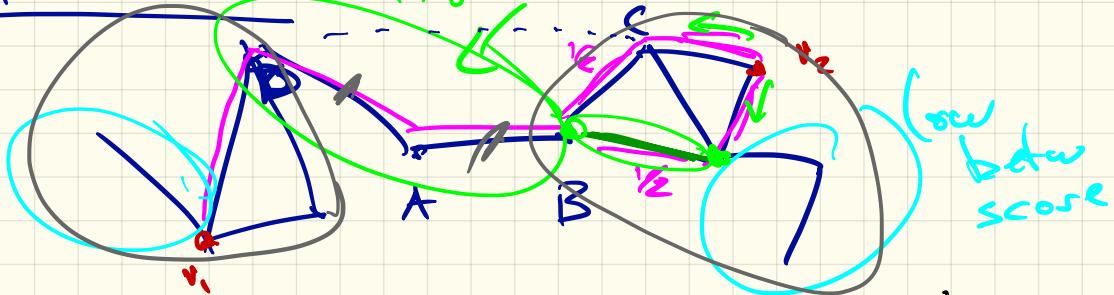
- new edges, more likely to form triangles than random.

Not
Erdős-Renyi:

If node i has
few triangles
 \hookrightarrow more likely depressed



Betweenness High betw score



Betw(A,B) = fraction of shortest paths
that use edge (A, B)

all pairs of $v_i, v_c \in V$

How important is edge (A, B) ?

Can define Betw(v_i)

→ Remaining connected components

Remove high betw edges.

Communities are not partitions

- tightly connected subset of graph.
- can overlap
- set does not need to partition V_n

Modularity defined on subset $C \subset V$

$$Q(C) = \left(\text{fraction edges in } C \right) - \left(\text{Exp from edges in groups} \right)$$

$$\frac{1}{|C|} \sum_{i \in C} \sum_{j \in C} A_{ij}$$

$$\frac{1}{|C|} \sum_{i \in C} \sum_{j \in C} E_{ij}$$

- Adjacency matrix $A_{ij} = \begin{cases} 1 & \text{if edge} \\ 0 & \text{otherwise} \end{cases}$

- Expected matrix $E_{ij} = \frac{d_i \cdot d_j}{2|E|}$



$d_i = \text{degree}$ $V_C = \# \text{edges which include } v_i$

$$Q(C) = \frac{1}{2|E|} \left[\sum_{i \in C} \sum_{j \in C} (A_{ij} - \frac{d_i \cdot d_j}{2|E|}) \right]$$

regularizer

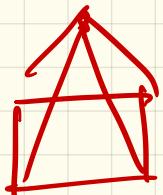
Clique in Graph

$G = (V, E)$

Motifs

subset

$S \subset V$



when all $v_i, v_j \in S$ have
 $\text{edge } (v_i, v_j) \in E$



Alg. to find all motifs
like Apriori Alg.

① Find all edges in G

② Search e_1, e_2 to check if triangle

③ Search  + check 4-clique