

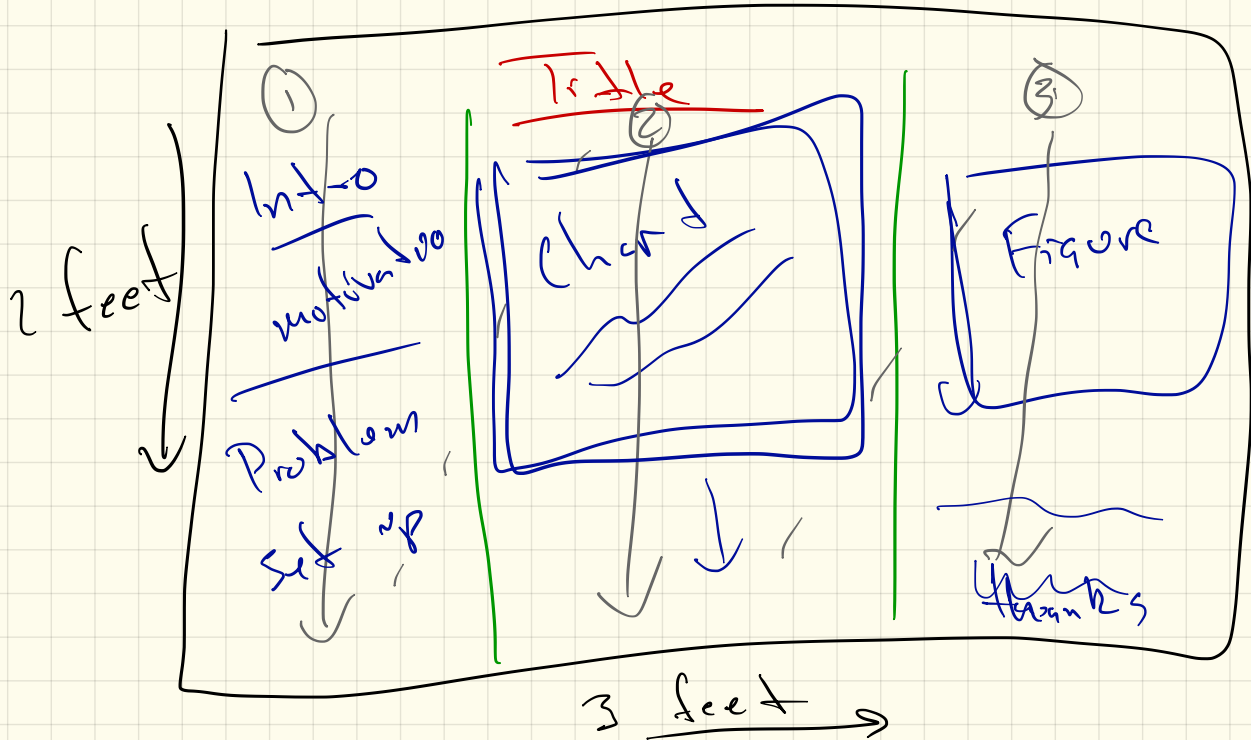
L24 : Graphs \rightarrow Communities

April 15, 2020

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Posters

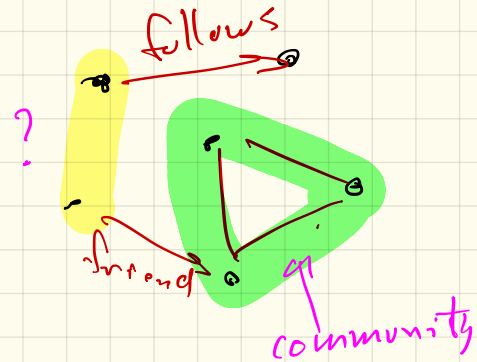
turn in pdf in canvas



Communities in Graphs

Graph $G = (V, E)$
↑
people/entities

How edges are defined
modeling choice.

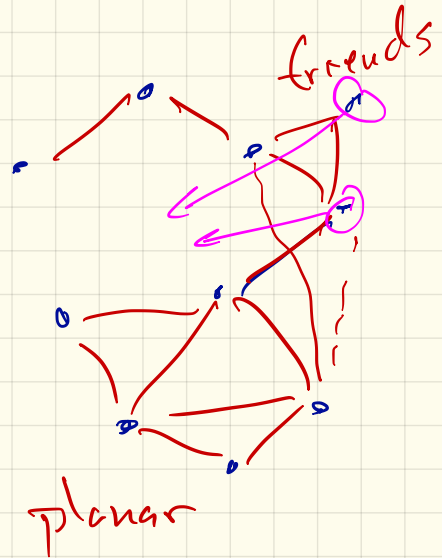


Early web business (.com-boom)
(circa 90s)

Sociology "social network"

manually collect
 $n \in [100, 200]$

Seniors in
high school



$$|V| \geq 1000$$



hair ball

Mathematical Models
of large graphs.

Erdős - Rényi :

Pick $n = |V|$
choose $p \in (0, 1)$



every edge
exist independently
w.p. p .

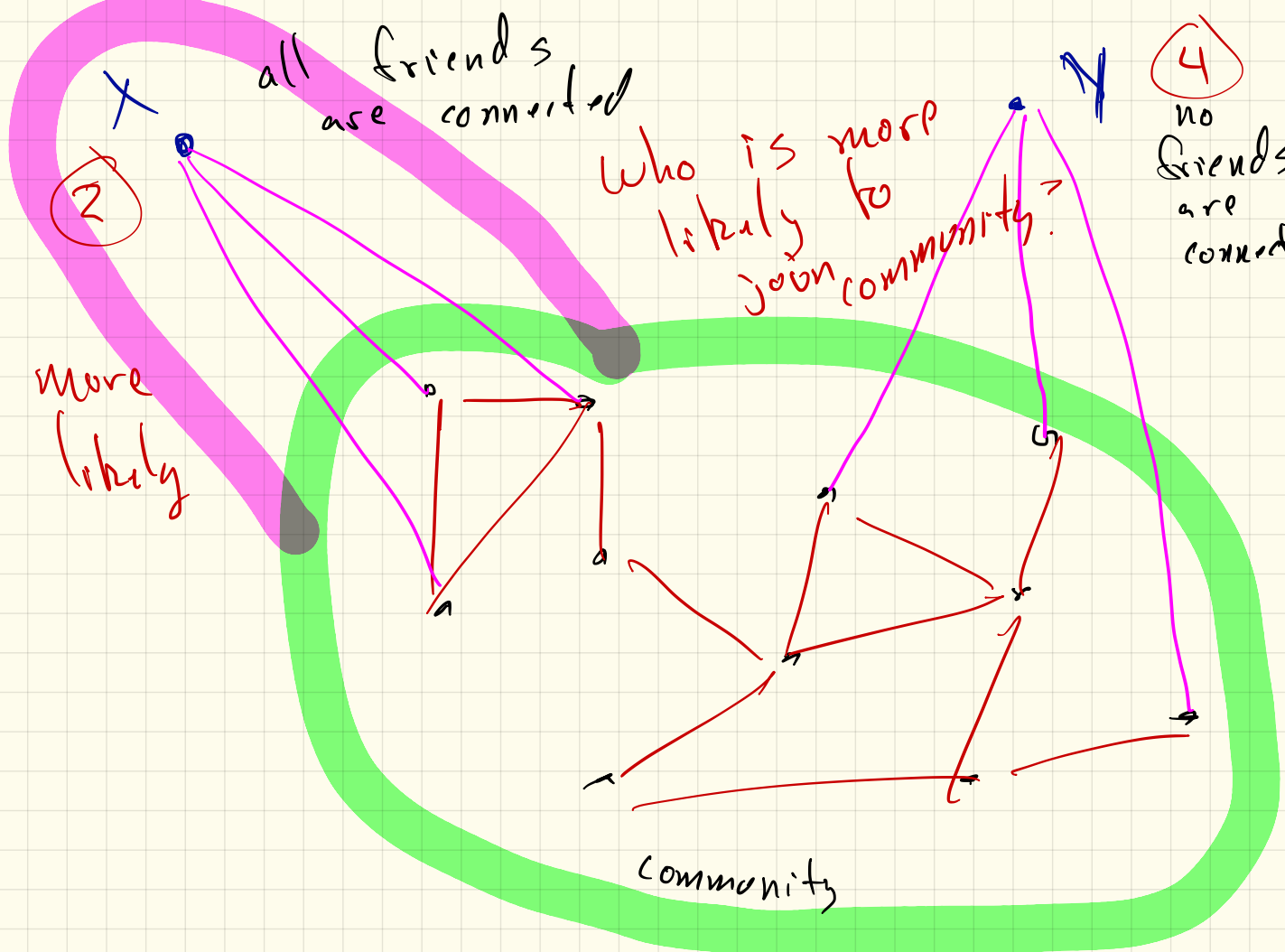
all friends
are connected

Who is more
likely to
join community?

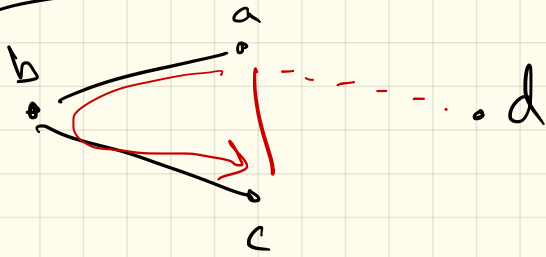
4
no
friends
are
connected

more
likely

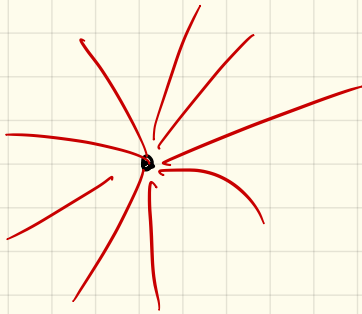
community



Preferential Attachment



more likely to form edge (a,c) than (a,d)



average person on twitter followed by ~ 500

most popular (Obama)
130 million followers

- How do we find
- communities (Spectral clustering)
 - important nodes/edges
pageRank

Community = tightly connected
subgraph $V' \subset V$
all edges defined
by V'

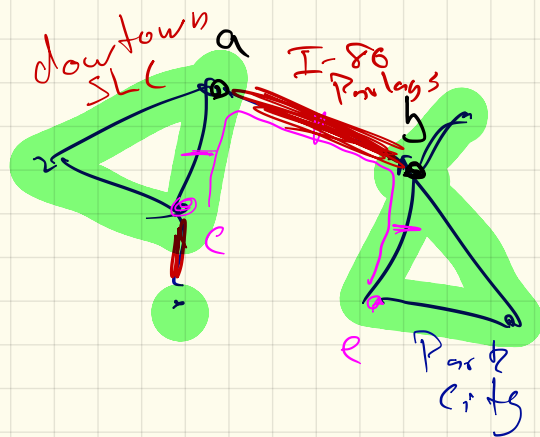
Betweenness : important edges.

↳ remove important edges
↳ remaining connected
components.

↳ communities

$$\underline{\text{betw}(a,b)} =$$

fraction of all
shortest paths
that use edge (a,b)



Modularity

$$G = (V, E)$$

$$|E| = 9$$

score

$$Q(C)$$

$$C \subset V$$

\equiv (fraction of edges in G_C)

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

(expected fraction of edges)

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

$$A = A_{ij} = \begin{cases} 1 & \text{if } uv \in E \\ 0 & \text{otherwise} \end{cases}$$

$$d_i = 4$$

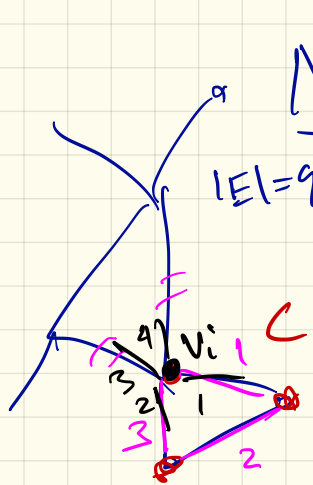
adjacency

matrix

expected edges

$$E_{ij} = \frac{d_j d_i}{2|E|}$$

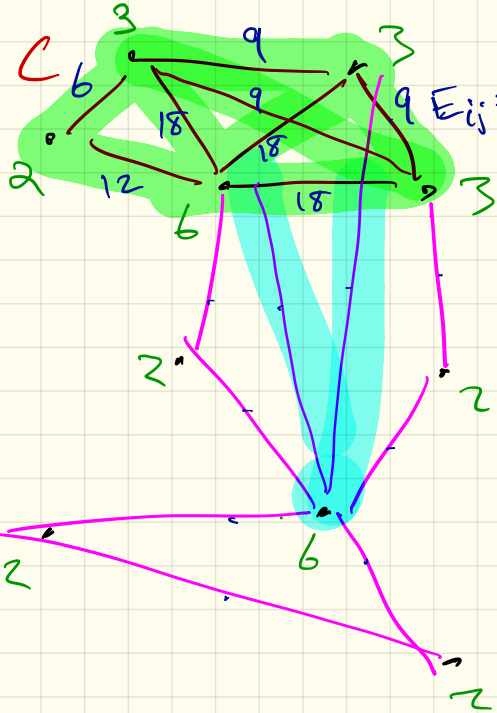
$$d_i = \text{degree of } v_i$$



$$Q(C) = \frac{1}{4|E|} \left[\sum_{i,j \in C} (A_{ij} - \gamma E_{ij}) \right]$$

$\underbrace{4|E|}_{68} \quad \underbrace{\sum_{i,j \in C}}_{8} \quad \underbrace{(A_{ij} - \gamma E_{ij})}_{\gamma}$

$Q(C) \in [-1/4, 1]$



$$E_{ij} = \frac{3 \cdot 3}{2 \cdot (1+1)}$$

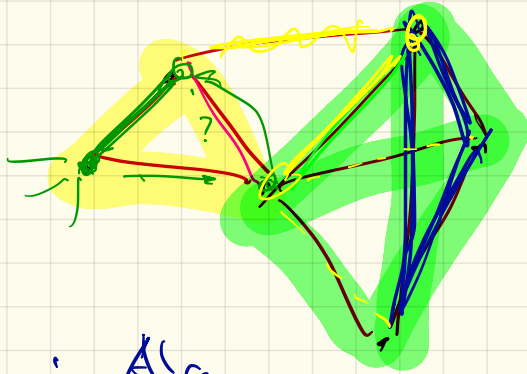
$$\sum_{i,j} E_{ij} = \frac{99}{34}$$

$$\frac{1}{68} \left[8 - \frac{99}{34} \right] \approx \frac{5}{68} \approx \frac{1}{14}$$

Find communities
 $C \in V$
 with largest $Q(C)$

Cliques

NP-hard



is set of vertices

$$C \subset V$$

where all edges

$$i, j \in C$$

have edge $(i, j) \in E$

A priori Alg.

2-cliques Start w/ all edges

3-cliques Find all triples of edges which have same 3 vertices

4-cliques - use 3-cliques, expand greedily