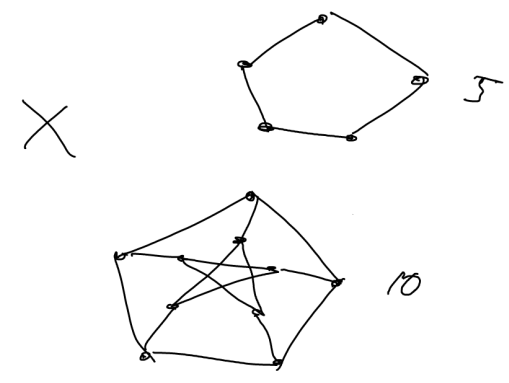


Large graphs - Graph Limits

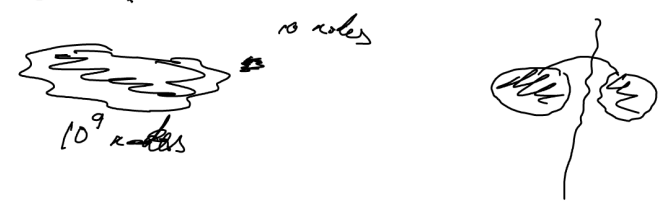
What we study

- graph of WWW / computer network
- social networks
- biological networks (animals & interactions)
- stat-physics - particles / links



What we ask

- Q1: Does the graph have an odd or even # of nodes? --- BAD Q
- Q2: Average degree = ? --- Good Q --- we need to allow for a prob. of error
- Q3: Is the graph connected?



Q4: MAX-CUT



How we can do it?

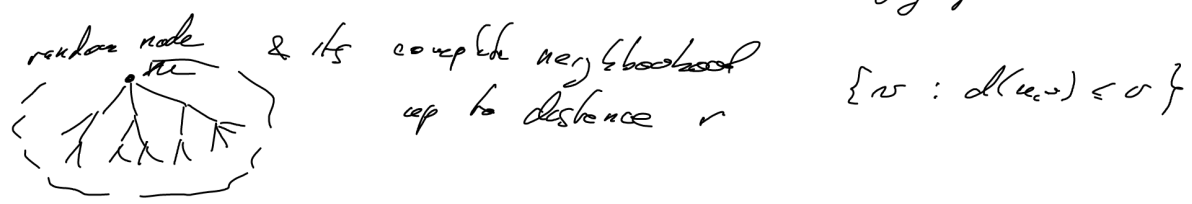
Sampling $|G|=n$
 take random subset $S \subset V(G)$ of size k
 look at $G[S]$ } pass-repeat



easy if we have a list of all nodes
 otherwise ... Markov chains

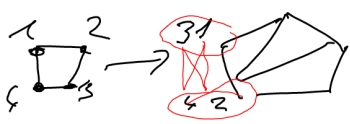
works well if $|E(G)| \approx c|V(G)|^2$
 dense graphs

if G is rather sparse ($d_{avg} = const$) --- random sample is a.s. empty graph



homomorphism

$f: F \rightarrow G$ is a map $f: V(F) \rightarrow V(G)$ s.t. $f(u)v \in E(F) \implies f(u)f(v) \in E(G)$



$hom(F, G) = \# \text{ of maps } F \rightarrow G$

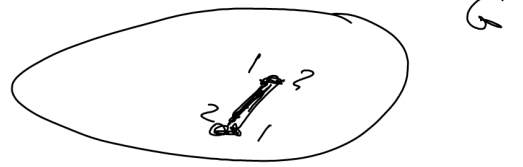
homomorph to $K_k \iff k$ -colouring, ...

f is 1-1 then G contains a copy of F

$\#$ of copies of $F = ?$ Find $\#$ of subgraphs of G isom. to F
 using homom.?

$$\text{hom} \left(\begin{array}{c} 1 \\ \downarrow \\ 2 \end{array}, G \right) = \sum_{v \in V(G)} \deg(v)$$

$$= 2|E(G)|$$



$$\text{hom} \left(\begin{array}{c} \circ \\ \downarrow \\ \circ \end{array}, G \right) = |E(G)|^2$$

of copies of K_2 in $G = \binom{|E(G)|}{2} = \#$ copies of K_2

undirected subgr.

$$= \binom{|E(G)|}{2} = \frac{1}{2} \text{hom} \left(\begin{array}{c} \circ \\ \downarrow \\ \circ \end{array}, G \right)$$

similarly for $k > 2$ — exercise

$$t(F, G) := \frac{\text{hom}(F, G)}{|G|^{|F|}} = P(\text{random mapping } V(F) \rightarrow V(G) \text{ is a homom.})$$

$\rightarrow \in \{0, 1\}$ $\ddot{\smile}$

\rightarrow homom. are well behaved (algebraic theory ... theory of categories)

How to model large graphs?

\rightarrow Erdős-Rényi (1959) — $G(n, p)$ $V = \{1, \dots, n\}$, each edge w. prob. p

(variants: $G(n, m)$ — $|V|=n$, $|E|=m$ $E \in \binom{V \times V}{m}$ uniform ...)

all vertices are almost the same

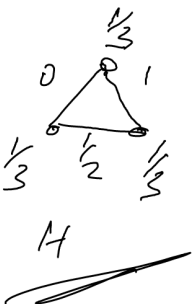
\rightarrow multitype random graphs $G(n, H)$

H -weighted graph $|H|=g$
 nodes have weight $\alpha_1, \dots, \alpha_g > 0$
 $\sum \alpha_i = 1$

Take n vertices, each chooses type i w. prob. α_i

edge have weight $\beta_{ij} \in [0, 1]$

$\#$ ways $\in \binom{[g]}{2}$ we decide if $uv \in E(G)$ w. prob. β_{ij} $i, j = \text{type of } u, v$



\uparrow random half of the edges

More generally: template can be a graphon: $W: [0,1]^2 \rightarrow [0,1]$

vertex choose a type $\sim \text{Unif}([0,1])$

symmetric fcn

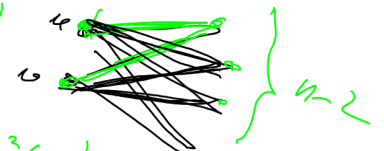
0	0	1	0
1	1	0	$\frac{1}{2}$
0	$\frac{1}{2}$	0	0
	0	1	1

Quasirandom graphs (Chung, Graham, Wilson 1989)

(G_n) -- seq. of graphs, $|G_n| \rightarrow \infty$ $0 < p < 1$

(QR1) Almost all degrees are $pn (1+o(1))$
 --- edges $p^2 n (1+o(1))$

$E \sim 1 - p(n-1)$



$E \sim p^2(n-2)$

(QR2) # fixed graph F , $\text{hom}(F, G) = p^{|F|} \cdot n^{|V(F)|} (1+o(1))$

$E \sim \text{hom}(F, G(n, p))$

$|G| = \frac{1}{2} \text{hom}(K_2, G)$

(QR3) $|G| = pn^2 (1+o(1))$

C_4 's = $\frac{1}{8} \text{hom}(C_4, G)$

C_4 -subgraphs = $\frac{p^4 n^4}{8} (1+o(1))$

(QR4) # S of $\frac{n}{2}$ nodes of G_n induces $\sim \frac{pn^2}{8} (1+o(1))$

(QR5) # $X, Y \subset V(G_n)$ disjoint : $|E_G(X, Y)| = \frac{p|X||Y|}{2} (1+o(1))$

\hookrightarrow Szemerédi reg. lem. E -reg. pair

Theorem QR1 \Leftrightarrow QR2 \Leftrightarrow QR3 \Leftrightarrow QR4 \Leftrightarrow QR5

Example Paley graphs $q \equiv 1 \pmod{4}$ & q prime

$V = \{0, 1, \dots, q-1\}$, $ij \in E \Leftrightarrow i-j \equiv k^2 \pmod{q}$ for some $k=1, \dots, q-1$

claim: Paley graphs are QR with $p = \frac{1}{2}$.

for all primes $q \equiv 1 \pmod{4}$

How to approximate large graphs?

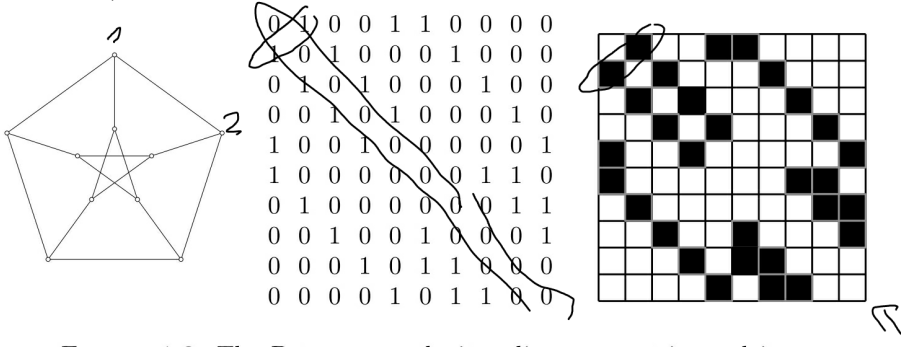


FIGURE 1.3. The Petersen graph, its adjacency matrix, and its pixel picture

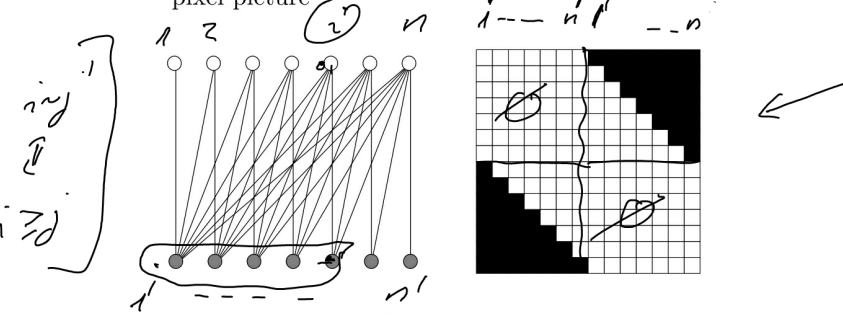
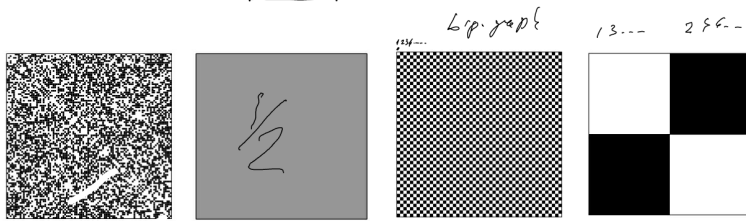
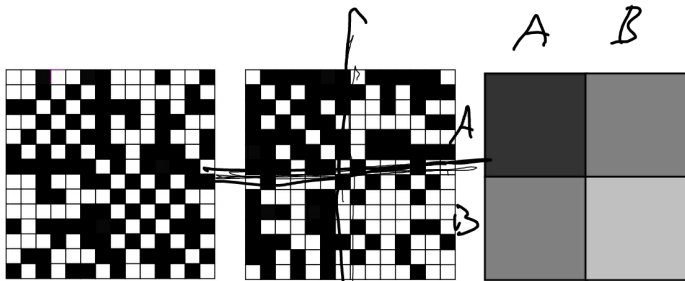


FIGURE 1.4. A half-graph and its pixel picture



rearrange rows & cols
--- new picture

FIGURE 1.5. A random graph with 100 nodes and edge density $1/2$, a random graph with very many nodes and edge density $1/2$, a chessboard, and the pixel picture obtained by rearranging the rows and columns.



reg. lemma
density in A
in B
between

FIGURE 1.6. A random-looking pixel picture, an informative rearrangement, and its regularity partition

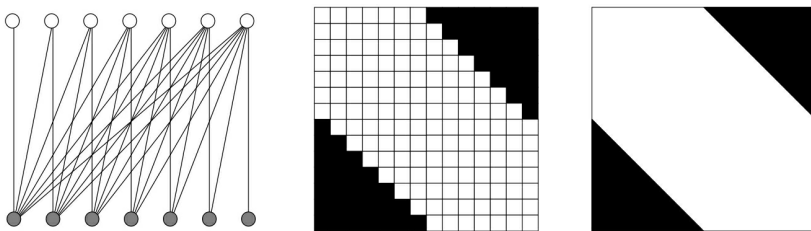


FIGURE 1.7. A half-graph, its pixel picture, and the limit function

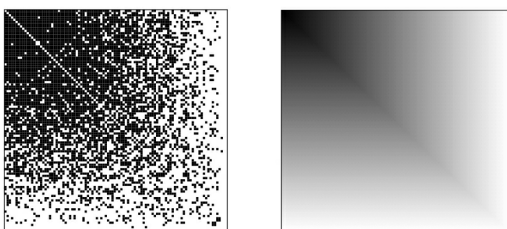


FIGURE 1.8. A randomly grown uniform attachment graph with 100 nodes, and a (continuous) function approximating it

graphs
symmet. funcs
 $w: \{0,1\}^2 \rightarrow \{0,1\}$
measurable
 $P(\{w(x_{ij}) \leq c\})$

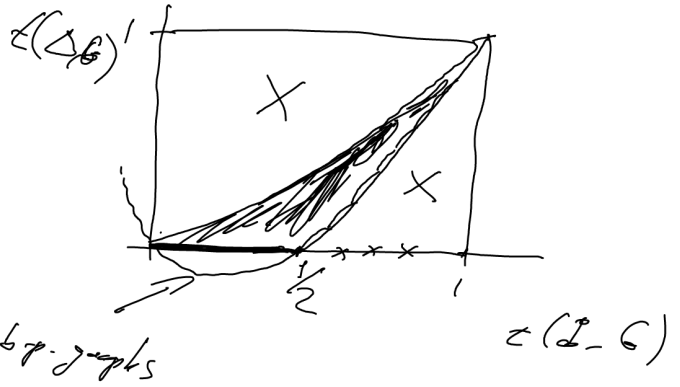
Applications to extremal graph theory

Mantel's thm / spec. hyp of Turán's thm:

$$|G| > \frac{n^2}{4} \Rightarrow G \cong K_3$$

$$t(I, G) > \frac{1}{2} \Rightarrow t(\Delta, G) > 0$$

General Q: For what $x, y \in [0, 1]^2$ is there G s.t. $t(I, G) = x, t(\Delta, G) = y$?



Goodman's thm

$$t(K_3, G) \geq t(K_2, G) \cdot (2t(K_2, G) - 1)$$

spec. case of Krasnik-Katona

$$t(K_3, G) \leq t(K_2, G)^{3/2}$$

Observations

$$F_1 F_2 := F_1 \cup F_2$$

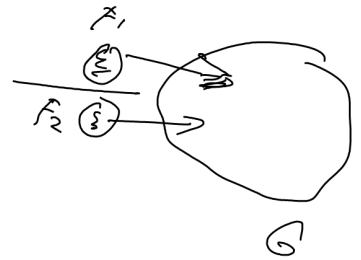
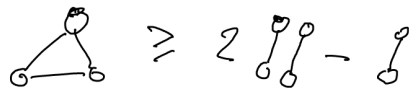
disj.

$$t(F_1 F_2, G) = t(F_1, G) + t(F_2, G)$$

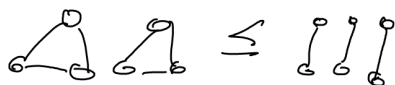
F well mean $t(F, G)$

$$F_1 F_2 = F_1 \cdot F_2$$

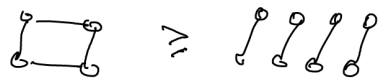
Goodman's thm: $K_3 \geq K_2 \cdot (2K_2 - 1) = \underline{2K_2^2 - K_2}$



Krasnik-Katona



$$t(C_4, G) \geq t(K_2, G)^2 \quad (\text{Erdős})$$

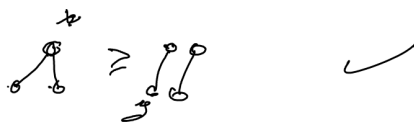


$$t(P_k, G) \geq t(K_2, G)^{k-1}$$

(P_k has k nodes)

(too veg. go. we have =)

$k=3$

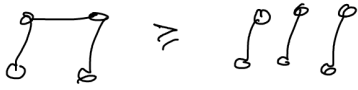


$$n \cdot \text{hom}(P_3, G) \geq \text{hom}(K_2, G)^2$$

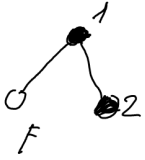
$$n \cdot \sum_{v \in V} \frac{\deg(v)^2}{n} \geq \left(\sum_{v \in V} \frac{\deg(v)}{n} \right)^2$$

(avg. of K_2)

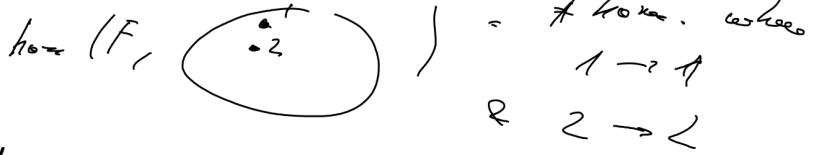
neg. arithmetic & quado. mean



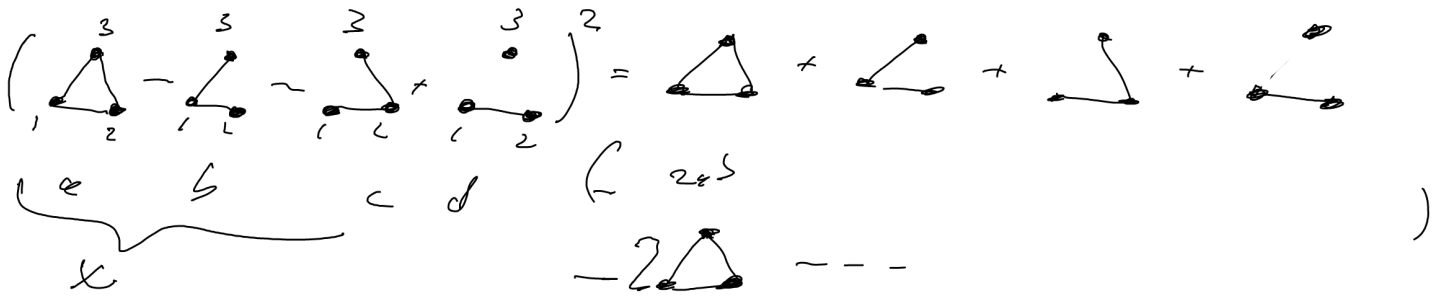
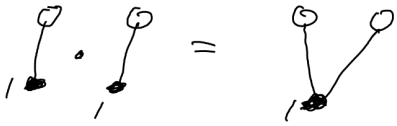
labeled graphs



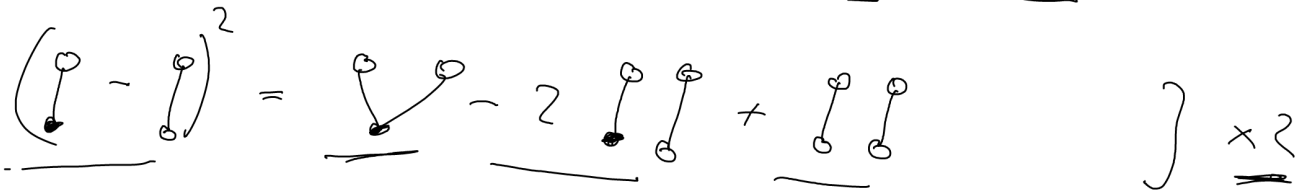
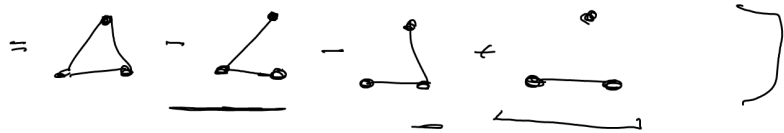
hom. need resp. labels



F_1, F_2 labeled : $F_1 - F_2 =$ disj. union + identif. of vertices with the same label



$x^2 = x$



$$\left(\text{graph with 2 vertices, 1 edge} \right)^2 + 2 \left(\text{graph with 2 vertices, 0 edges} \right)^2 = \text{triangle} - 2 \text{path of length 2} + \text{path of length 2} \geq 0$$

$$t(P_2; G) t(P_1; G), \quad \underline{t(P_1; G)} = t(P_1; G)$$



$$\geq 2 \text{path of length 2} - \text{path of length 2}$$

Goodman's imp. \checkmark

quantum graph algebra

flag algebras, Razborov