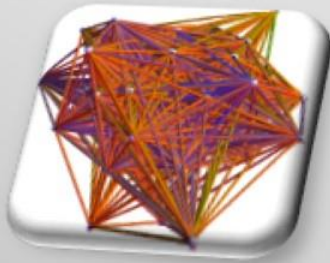
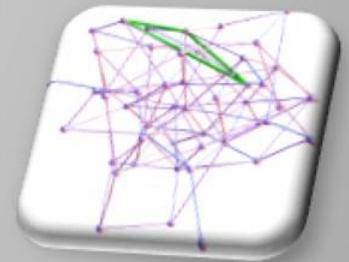


Stanford University, Jan 2014

RANDOM TRIANGLE REMOVAL



Eyal Lubetzky
Microsoft Research



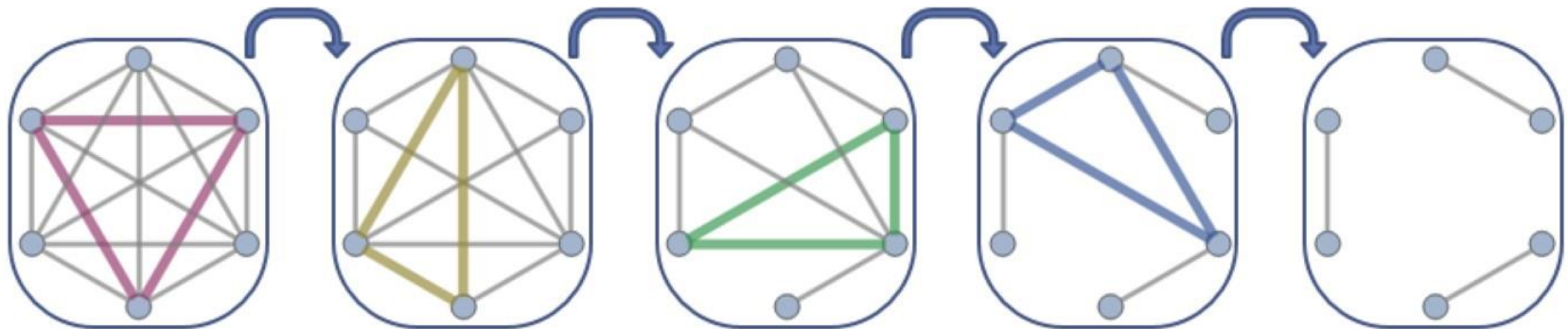
Joint work with
Tom Bohman and Alan Frieze

Problem definition

- ▶ Stochastic process (*random greedy triangle packing*):

- ▶ G_0 = complete graph on n vertices.

- ▶ $G_i \mapsto G_{i+1}$: select a **uniform triangle** in G_i (while \exists) and remove its 3 edges.



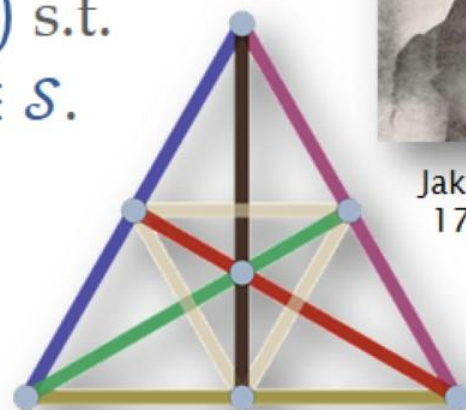
- ▶ QUESTION [Bollobás, Erdős (1990)]:

What is the expected number of edges in the final graph?

Motivation I. packing designs

▶ DEFINITION [Steiner 1853]: a *triple system* of order n is a set of triples $\mathcal{S} \subset \binom{[n]}{3}$ s.t. \forall pair (x, y) belongs to a *unique* $A \in \mathcal{S}$.

▶ e.g. $n = 7$: $\{1, 2, 4\}, \{2, 3, 5\}, \{1, 3, 6\},$
 $\{1, 5, 7\}, \{3, 4, 7\}, \{2, 6, 7\}, \{4, 5, 6\}$



Jakob Steiner
 1796–1863

▶ [Kirkman 1847]: exists iff $n \equiv 1, 3 \pmod{6}$.

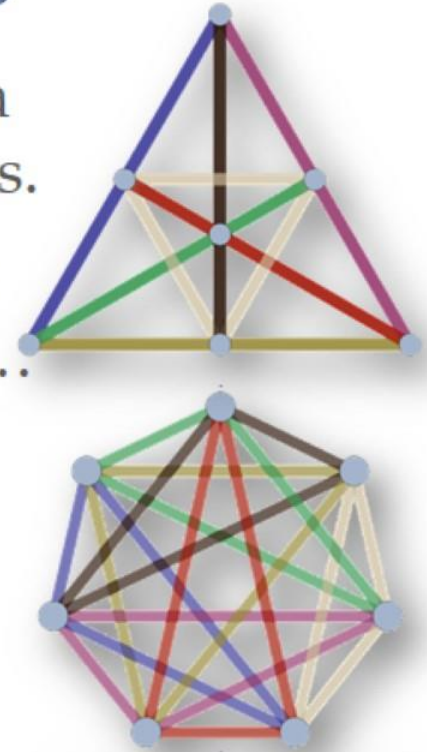


Thomas Kirkman
 1806–1895

n	7	9	13	15	19
# STS	1	1	2	80	11084874829

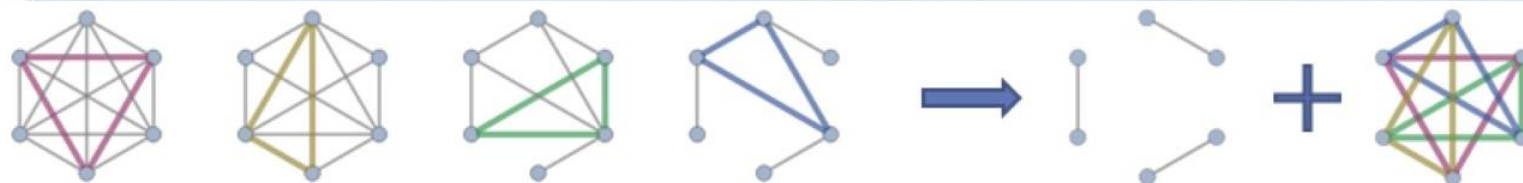
Motivation I. packing designs

- ▶ Steiner triple system \equiv partition edges of a complete graph into edge-disjoint triangles.
 - general Steiner systems: hypergraphs...
 - constructions: group theory, geometry,...
- ▶ Recipe for a *near optimal* system (few pairs not covered) – *greedy packing*:
 - Order all $\binom{n}{3}$ triplets uniformly.
 - In this order, add each triplet that does not already intersect an existing one with an edge.
- ▶ *Exactly the triangle removal process...*



Packing via triangle removal process

- ▶ G_0 = complete graph on n vertices.
- ▶ $G_i \mapsto G_{i+1}$: remove edges of a **uniform triangle** in G_i .



$$\tau_0 = \min\{i : G(i) \text{ is triangle free}\}$$

- ▶ $\forall i: |E(G_i)| = \binom{n}{2} - 3i \Rightarrow$ equivalent questions:

final number of edges

of steps to terminate

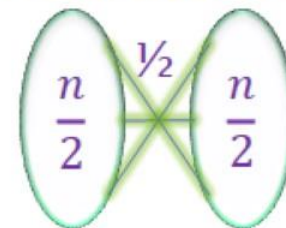
Δ 's packed via random greedy

Motivation II. Δ -free networks

▶ What does a typical Δ -free graph on n vertices look like?

- ▶ [Erdős, Kleitman, Rothschild '76]:

a.e. such graph: bipartite with about $n^2/8$ edges.



- ▶ [Prömel, Schickinger, Steger '02]:

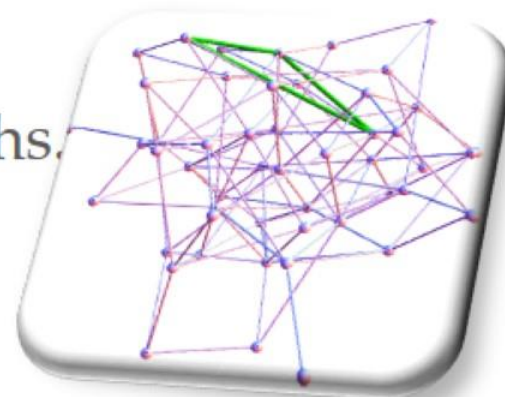
a.e. non-bipartite one: can be made bipartite by deleting a vertex.

- ▶ [Osthus, Prömel, Taraz '03]: specifying the # of edges:

a.e. Δ -free graph with $p\binom{n}{2}$ edges: bipartite as long as $\sqrt{\frac{3 \log n}{16 n}} \leq p < 1$.

▶ Output of *Triangle removal process* :
nontrivial distribution on Δ -free graphs.

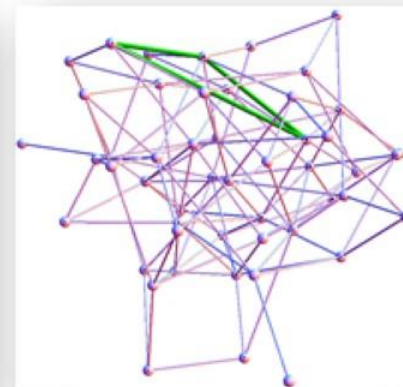
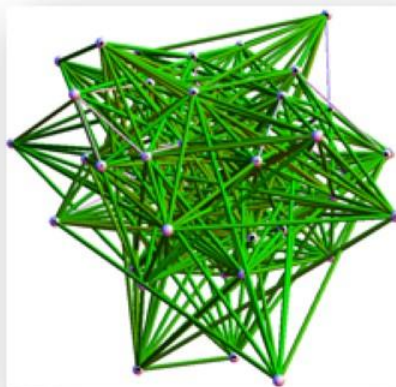
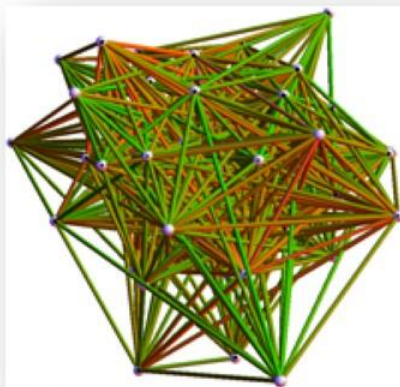
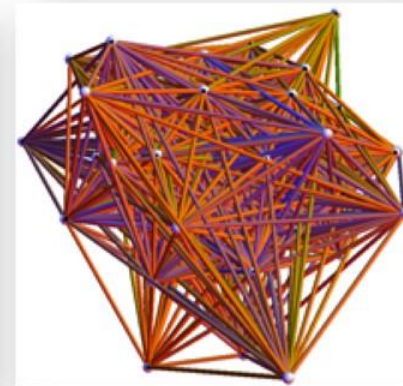
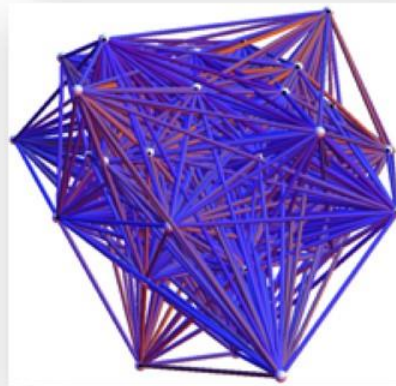
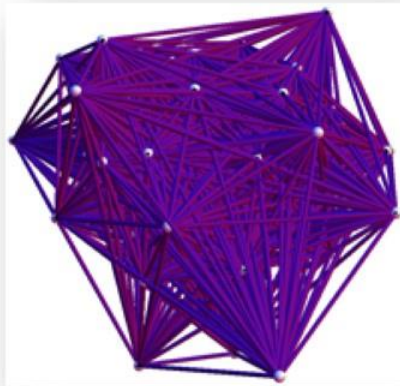
- ▶ similar to a random graph $\mathcal{G}(n, p)$;
- ▶ and yet no triangles...



Motivation III. Ramsey theory

- ▶ DEFINITION: $R(3, t)$ = minimum n such that
 $\forall \Delta$ -free graph on n vertices \supset **independent set** I of size t .
 - ▶ (\equiv): *How small can the independence number of a Δ -free graph be?*
 - ▶ [Erdős '61]: $\exists \Delta$ -free graph with **no** I of size $c\sqrt{n} \log n$.
 - ▶ [Ajtai, Komlós, Szemerédi '80]: $\forall \Delta$ -free graph $\supset I$ of size $c\sqrt{n \log n}$.
 - ▶ [Kim '95]: $\exists \Delta$ -free graph with **no** I of size $C\sqrt{n \log n}$.
- ▶ Triangle removal process:
 - ▶ Tractable (hopefully) stochastic process ending with a Δ -free graph having (hopefully) *many* edges.
 - ▶ Towards the leading order constant for $R(3, t)$?

Sample run of the process



50 vertices, 371 steps, 115 remaining edges

An exponent of $3/2$

- ▶ CONJECTURE [Bollobás, Erdős (1990)]:

Expected final # edges has order $n^{3/2}$.



Béla Bollobás

Paul Erdős
1913–1996

- ▶ Intuition:

- ▶ G_i should behave like an Erdős-Rényi graph $\mathcal{G}(n, m)$ with $m = |E(G_i)| = \binom{n}{2} - 3i$ edges.
- ▶ At $m = \varepsilon n^{3/2}$ there are $\sim \frac{4}{3} \varepsilon^3 n^{3/2}$ triangles in $\mathcal{G}(n, m)$
- ▶ Removing all triangles still leaves $\asymp n^{3/2}$ edges in G_{τ_0} .

- ▶ $o(n^2)$ is already nontrivial: implies that *random greedy* constructs a near-optimal Steiner triple system.

Previous work



- ▶ [Spencer (1995)] and [Rödl, Thoma (1996)]:
Final # edges is $o(n^2)$ with high probability.

- ▶ [Grable (1997)]:

Final # edges is at most $n^{7/4+o(1)}$ w.h.p.

Best known upper bound.

No lower bounds known.

- ▶ [Gordon, Kuperberg, Patashnik, Spencer ('96)]:
simulations supporting the answer $n^{3/2+o(1)}$.

- ▶ [Wormald (1999)]:

Final # edges is at most $n^{2-\frac{1}{57}+o(1)}$ w.h.p.

(method applies to general case of random greedy packing in k -uniform hypergraphs.)



[S95] [RT96] — 2
[W99] — 1.98
[G97] — 1.83
[G97] — 1.75



Previous work (ctd.)



- ▶ [Alon, Kim, Spencer (1997)]:
 - semi-random variant of the process finds nearly perfect hypergraph matchings. Specialized to Δ 's:

Variant process leaves $O(n^{3/2} \log^{3/2} n)$ final edges w.h.p.

- Conjectured that *random greedy* matches these results:
CONJECTURE [Alon, Kim, Spencer (1997)]:

Random greedy for k -tuples w. pairwise intersections $\leq k - 2$ has $\mathbb{E}[\#\text{uncovered } (k - 1)\text{-tuples}] \leq n^{k-1-\frac{1}{k-1}+o(1)}$.

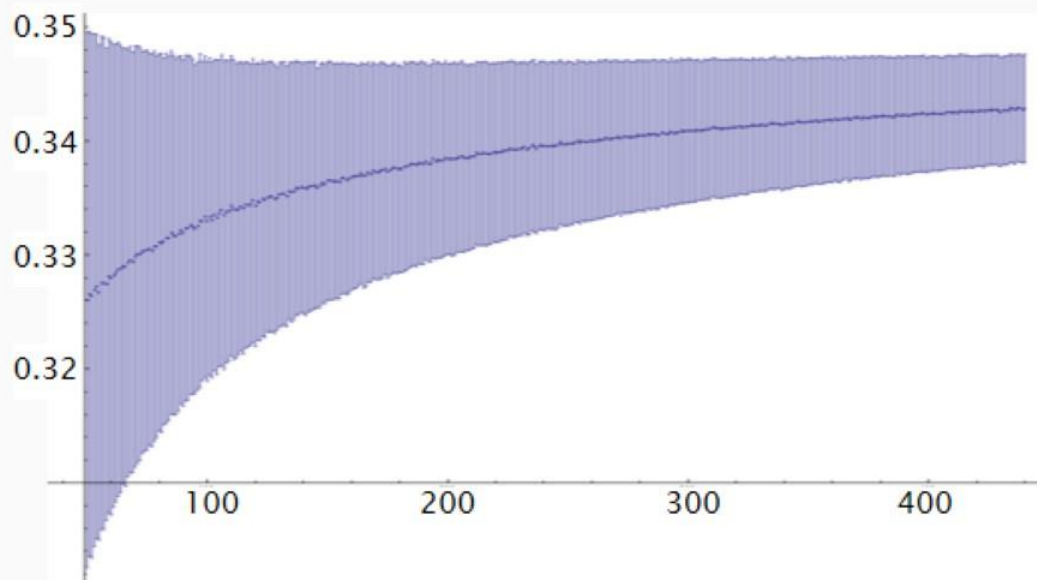
"...at the moment we cannot prove that this is the case even for $k = 3$ "

- ▶ Spencer offered **\$200** for a proof of $n^{3/2+o(1)}$.

Main result

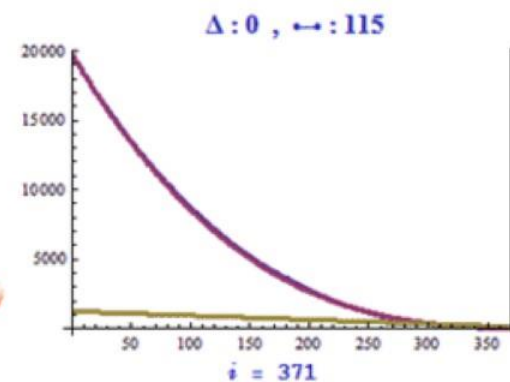
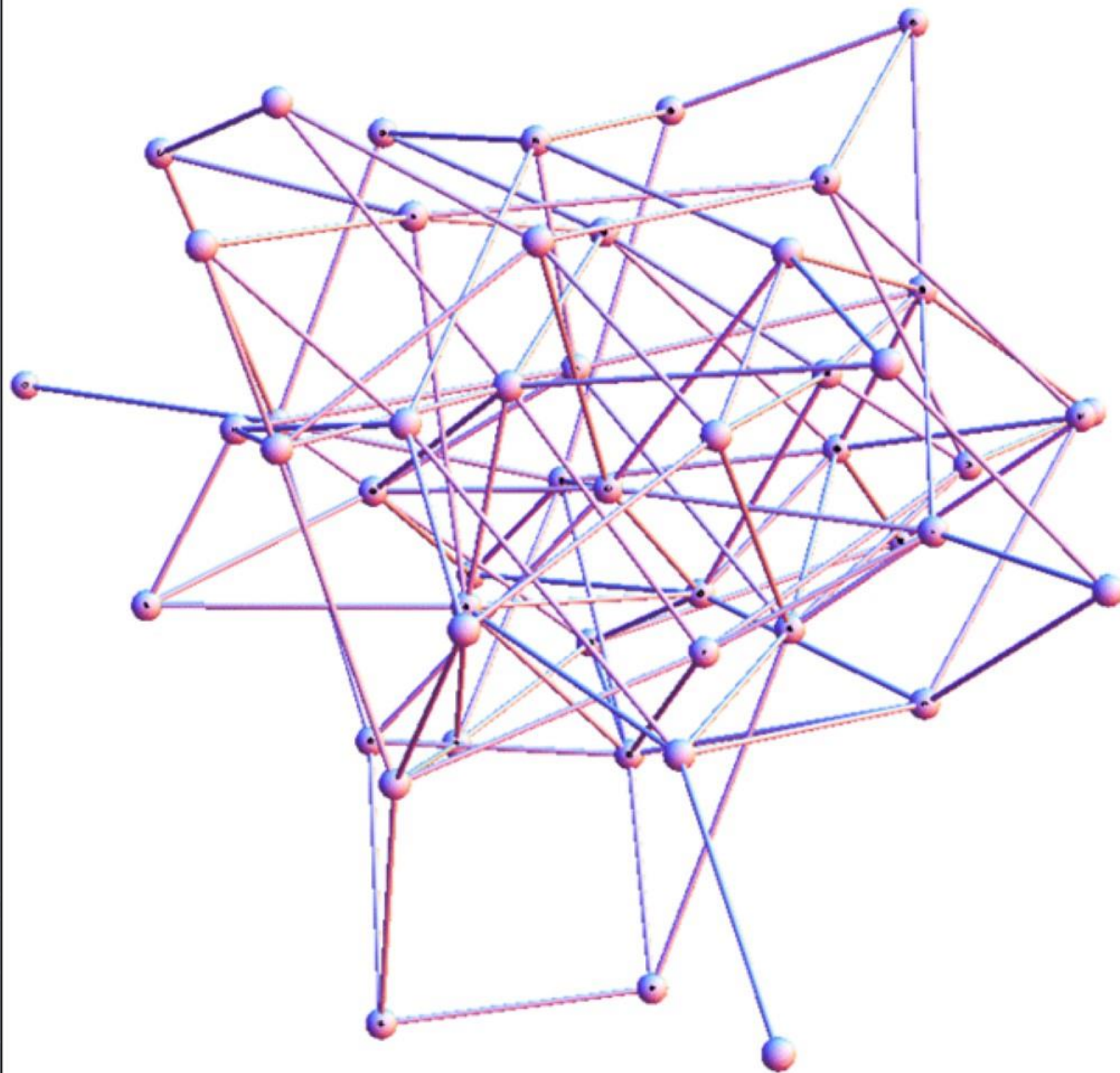
► THEOREM [Bohman, Frieze, L.]:

*With high probability $\tau_0 = n^2/6 - n^{3/2+o(1)}$,
or equivalently, $|E(G_{\tau_0})| = n^{3/2+o(1)}$.*



Simulations:
Final # edges
over $n^{3/2}$

Self correction



Self correction

- ▶ Goal: maintain concentration of the total number of triangles.
- ▶ Key: co-degrees.

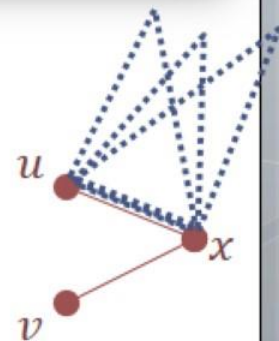
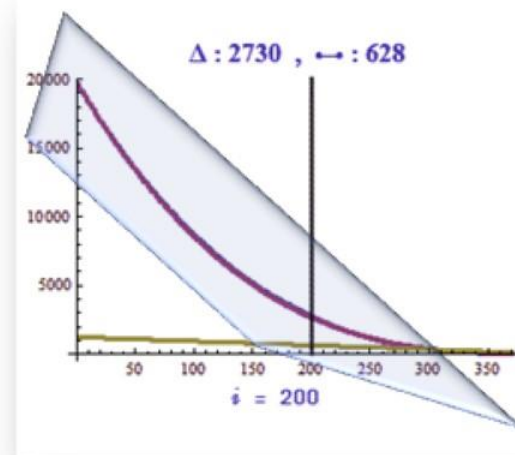
$$Q = Q(i) = \# \text{ triangles in } G_i$$

$$Y_{uv} = Y_{uv}(i) = \text{co-degree of } u, v \text{ in } G_i$$

- ▶ Co-degree evolution:

$$\mathbb{E}[\Delta Y_{uv} \mid \mathcal{F}_i] = -\frac{1}{Q} \sum_{x \in Y_{uv}} (Y_{ux} + Y_{vx} - \mathbb{1}_{u \sim v})$$

- ▶ Similar to the form $\mathbb{E}[dX] \leq -a X$:
 - ▶ the larger X is, the bigger the drift towards its mean.



Self correction: the fine print

- ▶ Re-examining the key: co-degrees.

$$Y_{uv} = Y_{uv}(i) = \text{co-degree of } u, v \text{ in } G_i$$

1. once edge density drops to $p \approx \frac{1}{2}$
then $Y_{uv} \approx \text{Bin}(n, p^2)$; $\text{STDEV} = \sqrt{n}$.

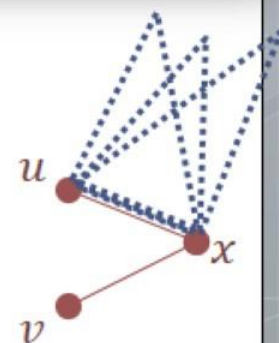
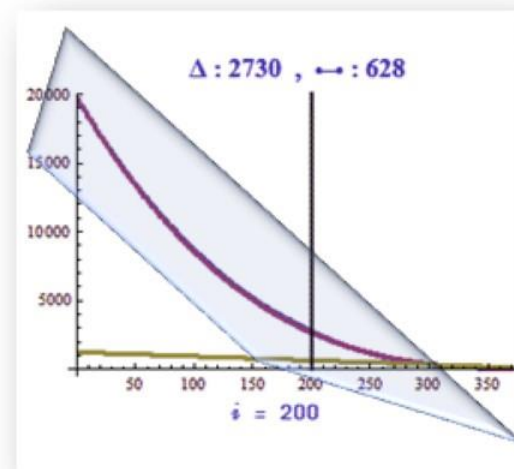
2. this will match our mean of np^2
once $p = n^{-1/4}$

➤ Method breaks at $n^{7/4}$ edges...

▶ Crucial: *error estimates improve over time!*

▶ New general framework to support this.

➤ Later used by [Bohman, Keevash] to improve bounds on $R(3, t)$ to within a factor of 4 (independently proved by [Pontiveros *et al.*]).



Context: the Δ -free process

- ▶ Adding edges instead of deleting them:

- ▶ $G'_0 =$ complete graph on n vertices.

- ▶ $G'_i \mapsto G'_{i+1}$: add a **uniform edge** that does not add a Δ .

- ▶ [Erdős-Suen-Winkler (1995)]:

Final # of edges in Δ -free process = $n^{3/2+o(1)}$ w.h.p.

- ▶ [Bohman (2010)]:

Final # of edges in Δ -free process $\asymp n^{3/2} \sqrt{\log n}$ w.h.p.

- ▶ Main differences:

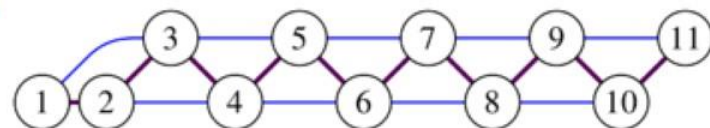
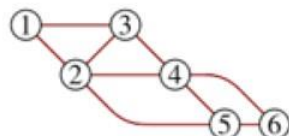
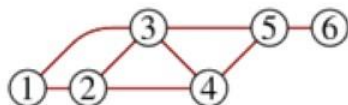
1. Triangle-removal goes through $n^2/6 - n^{3/2+o(1)}$ steps *vs.* $n^{3/2+o(1)}$ steps in the Δ -free process.
2. Δ -free is “well behaved” until the very end...

Context: the Δ -free process (ctd.)

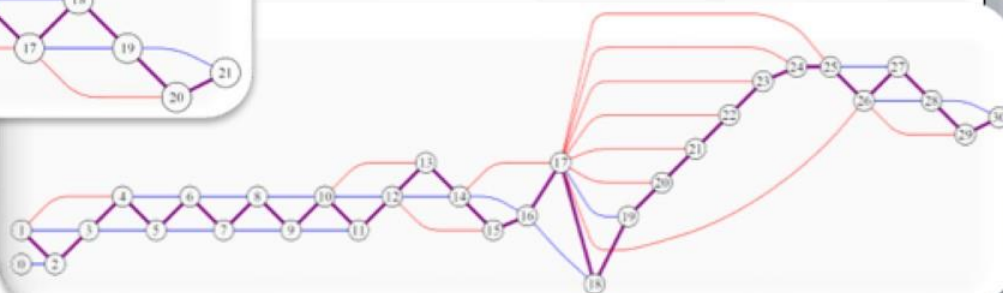
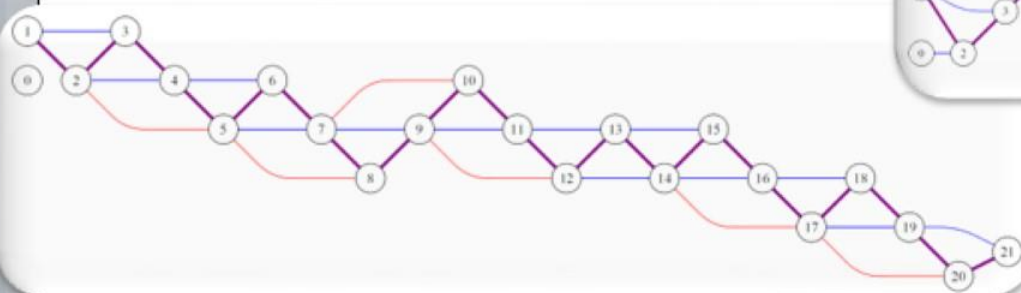
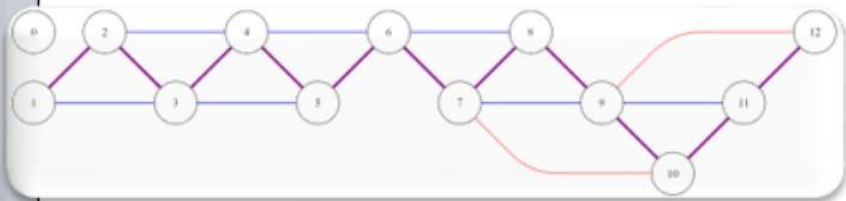
- ▶ Δ -free process:
 - Forbidden edges are pairs with a positive co-degree.
 - These are *negligible* until there are $\asymp n^{3/2}$ edges...
 - Coupling to $\mathcal{G}(n, m)$ readily gives a lower bound.
- ▶ Triangle removal:
 - Already when the edge density is a small **constant** ε # forbidden triangles \gg # legal ones ...
 - Tracking the process to $p = n^{-\varepsilon}$ requires delicate control over geometry of remaining triangles.

Proof ingredients

- ▶ Starting point: system of martingales tracking the evolution of $\text{poly}(n)$ variables w.r.t. $\mathcal{G}(n, m)$ values.
- ▶ Self correction: errors *decrease* as process evolves.
- ▶ Objective: track *all* co-degrees followed by the # Δ 's.
 - Naïve approach breaks at $7/4$ matching Grable's result via a very different method (physical barrier).
 - More ingredients help push the exponent further, but eventually subgraphs become too sparse to track...
- ▶ Construct canonical family of $e^{O(1/\varepsilon)}$ graphs by gluing $O(1/\varepsilon)$ triangles in a prescribed manner; track all graph homomorphisms from them.



Triangular ladders



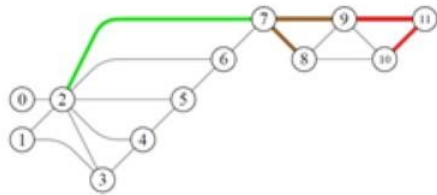
Some of the $\approx 2^{30}$ labeled rooted graphs whose homomorphisms-counts are tracked to imply

$$|E(G_{\tau_0})| \leq n^{3/2+\varepsilon} \text{ for } \varepsilon = \frac{1}{10}.$$

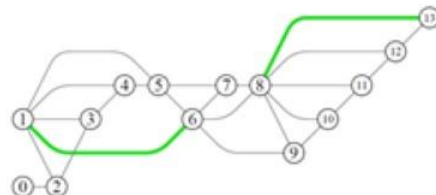
Triangular ladders

- ▶ Controlling one ladder is achieved via longer ones.
- ▶ End game: crucially relies on the ladder's length...
- ▶ Each variable features a self correcting estimate.

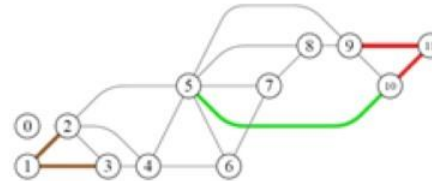
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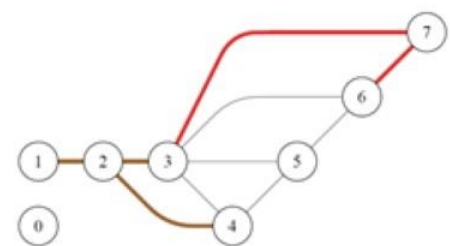
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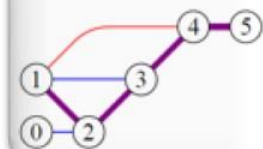
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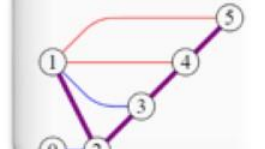
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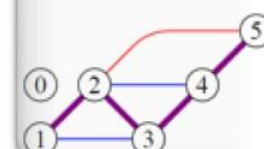
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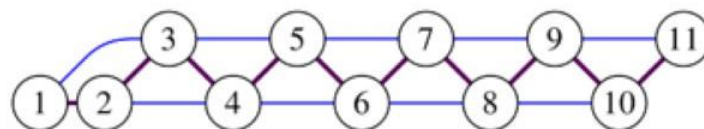
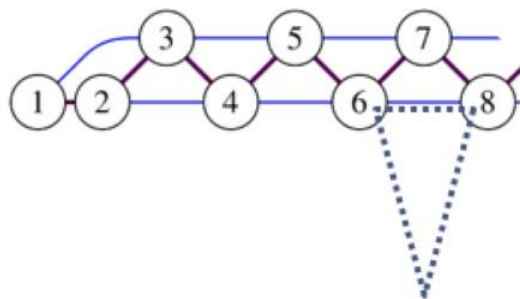
Triangular ladders: example

- ▶ A simple lemma:

If $(x_i)_{i \in I}$ and $(y_i)_{i \in I}$ sat. $|x_i - x| \leq \delta_1$ and $|y_i - y| \leq \delta_2$ for some $x, y \in \mathbb{R}$ and $\forall i \in I$ then

$$\left| \sum_{i \in I} x_i y_i - \frac{1}{|I|} (\sum_{i \in I} x_i) (\sum_{i \in I} y_i) \right| \leq 2|I| \delta_1 \delta_2.$$

- ▶ E.g., to control:
it suffices to handle:



Simple concrete example

▶ Recall: $Q(i) \triangleq \# \Delta's$; $Y_{uv}(i) \triangleq \text{co-degree of } u, v$.

▶ THEOREM:

Suppose $|Y_{uv} - np^2| \leq n^{3/4}$ for all u, v and $i \leq i_0$.

Then with high probability $Q \leq \frac{1}{6}n^3p^3 + \underbrace{\frac{1}{3}np^2}$.

additive error decreases with time!

▶ Recipe for utilizing self correction:

- Estimate expected change in terms of Q itself.
- Set a threshold γ just below desired upper bound Γ .
- Show that while $Q \in [\gamma, \Gamma]$ it is a supermartingale.
- Concentrate Q with error probability n^{-100} .

Simple concrete example (ctd.)

▶ GOAL: $Q \leq \frac{1}{6}n^3p^3 + \frac{1}{3}np^2$ given $|Y_{uv} - np^2| \leq n^{3/4} \forall u, v$

▶ PROOF:

▶ Analysis of one-step change:

$$\mathbb{E}[\Delta Q \mid \mathcal{F}_i] = -\frac{1}{Q} \sum_{uvw \in Q} (Y_{uv} + Y_{vw} + Y_{uw} - 2) = 2 - \frac{1}{Q} \sum_{uv \in E} Y_{uv}^2$$

▶ Since $\sum_{uv \in E} Y_{uv}^2 \geq 9Q^2/|E|$:

$$\mathbb{E}[\Delta Q \mid \mathcal{F}_i] = 2 - \frac{1}{Q} \sum_{uv \in E} Y_{uv}^2 \leq 2 - \frac{18}{n^2p} Q.$$

▶ Suppose $Q(i) > \frac{1}{6}n^3p^3 + \frac{1}{4}n^2p$. Then

$$\mathbb{E}[\Delta Q \mid \mathcal{F}_i] \leq -3np^2 - \frac{5}{2}.$$

Simple concrete example (ctd.)

➤ Suppose Q just entered $[\gamma, \Gamma]$ for $\begin{cases} \gamma = n^2 p/4 \\ \Gamma = n^2 p/3 \end{cases}$.

➤ Set $Z = Q - \left(\frac{1}{6}n^3 p^3 + \frac{1}{3}n^2 p\right)$.

➤ As $\Delta p = -6/n^2$ the change in the scaling term is
 $\sim \frac{6}{n^2} \left[\frac{1}{2}n^3 p^2 + \frac{1}{3}n^2\right] \sim 3np^2 + 2$

▪ Recall: $\mathbb{E}[\Delta Q \mid \mathcal{F}_i] \leq -3np^2 - \frac{5}{2}$.

➤ As long as $Q \in [\gamma, \Gamma]$ we get

$$\mathbb{E}[\Delta Z \mid \mathcal{F}_i] \leq -\frac{1}{2} + o(1) < 0,$$

a supermartingale.

Simple concrete example (ctd.)

- Next: concentrate $Z = Q - \left(\frac{1}{6}n^3p^3 - \frac{1}{3}n^2p\right)$.
- Number of steps remaining: $\leq |E| \asymp n^2p$
- Deviation considered: $\frac{1}{12}n^2p$.
- Lipschitz constant for one step:
 - Q changes by some $-(Y_{uv} + Y_{vw} + Y_{uw}) + O(1)$.
 - Scaling term changes by $\sim 3np^2 + 2$.
 - Together: $O(n^{3/4})$ thanks to co-degree estimates!
- By Hoeffding's inequality:

$$\mathbb{P}[\exists j: Z(j) - Z(0) > \frac{1}{12}n^2p] \leq \exp(-c\sqrt{n}p) .$$
- W.h.p. we will never cross the $[\gamma, \Gamma]$ interval. ■

Lower bound

▶ THEOREM:

Suppose $Y_{uv} \sim np^2$ for $\forall u, v$ and all

$$p \geq p_0 = n^{-1/2+\varepsilon}.$$

Then w.h.p. the final # edges is at least $c n^{3/2-6\varepsilon}$.

▶ PROOF:

- ▶ Important ingredient: a variant of the upper bound on Q with the *correct* additive error:

$$\text{w.h.p. } Q \leq \sim \left[\frac{1}{6} n^3 p^3 + \frac{1}{6} np^2 \right] \text{ at all times.}$$

- ▶ (we demonstrated an additive error of $\frac{1}{3} np^2$.)

Lower bound (ctd.)

- Assume: $Q \leq \left[\frac{1}{6}n^3p^3 + \frac{1}{6}np^2 \right] \forall p.$
- Consider time $p = p_1 = \delta/\sqrt{n}$ for small enough $\delta > 0$.
 - # edges: $|E| \sim \frac{1}{2}n^2p = \frac{1}{2}\delta n^{3/2}.$
 - # triangles: $Q \leq \underbrace{\frac{1}{6}\delta^3 n^{3/2}}_{\text{negligible}} + \underbrace{\frac{1}{6}\delta n^{3/2}}_{\text{why } \frac{1}{6} \text{ mattered: } |E|/3}.$
- If $Q < \frac{1-\alpha}{6}\delta n^{3/2}$ then $Q < \frac{1-\alpha}{3}|E|$ and necessarily there will be $cn^{3/2}$ edges at the end of the process (done).
 - \Rightarrow may assume: $Q \approx \frac{1}{3}|E|.$

Lower bound (ctd.)

- At time $p = p_1 = \delta/\sqrt{n}$ for small enough $\delta > 0$:
 - # edges: $|E| = c n^{3/2}$; # triangles: $Q \approx \frac{1}{3}|E|$.
- If $cn^{3/2}$ edges have no triangles on them \Rightarrow done.
 - \Rightarrow may assume: almost \forall edge incident to a Δ .
- Combined: **almost all triangles are edge-disjoint.**

At time p_0 every co-degree is $\sim n^{2\varepsilon}$
 \Rightarrow every triangle is incident to $\sim 3n^{2\varepsilon}$ others.



At time p_1 there are $cn^{3/2}$ “isolated” triangles.

Lower bound (ctd.)

- Look at triangles just before they became isolated:
 - Mark a triangle once it has an edge with co-degree 1 (no other triangles resting on this *special* edge.)
 - Filter a subset \mathfrak{X} of marked Δ 's where if $R \in \mathfrak{X} \Rightarrow$ no $S \sim R$ (incident triangle) is in \mathfrak{X} nor any $T \sim S$.
 - $|\mathfrak{X}| \geq n^{-4\varepsilon} \times cn^{3/2}$ (pay $n^{2\varepsilon}$ per level by co-degrees).
- If an arbitrary neighbor S of $R \in \mathfrak{X}$ is drawn before any of its own neighbors: the *special* edge of R survives!
 - $\mathbb{P}(\text{this event}) \gtrsim n^{-2\varepsilon}$; events are independent.
 - W.h.p. final # edges is $cn^{-2\varepsilon}|\mathfrak{X}| \geq cn^{3/2-6\varepsilon}$. ■

Open problems

1. Establish the order of the final number of edges.
2. Study the graph properties of the final output (a nontrivial distribution over triangle-free graphs).
3. Compare final output of the *triangle removal process* with that of the *triangle-free process*.
4. Obtain the leading constant for $R(3, t)$.

Thank you

