A fourth moment theorem for estimating subgraph counts in large graphs

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UW

Joint work with Nitya Mani

Task: Given a large graph, count (estimate) number of triangles.



- Basic statistical task.
- Can carry latent geometric information about embeddings.
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Subgraph Counting - Subsampling

Idea: Subsample the vertices and count monochromatic triangles.



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- In expectation should be proportional to the total count.
- Is this consistent? How effective?

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Consistency: For a sequence of graphs G_n and their (random) monochromatic triangle counts $T(G_n)$, we say that $T(G_n)$ is a consistent estimator if, for some deterministic sequence a_n ,

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For the efficiency of $T(G_n)$ we also need to bound the error.

Question

What is the asymptotic distribution of (a normalized) $T(G_n)$?



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Formal Setting

- $G_n = (V_n, E_n)$ graphs with $|V_n| \to \infty$, H fixed subgraph.
- Randomly color V_n with c colors and set

 $T(H, G_n) =$ #Monochromatic copies of H.

Normalize

$$Z(H, G_n) = \frac{T(H, G_n) - \mathbb{E}[T(H, G_n)]}{\sqrt{\operatorname{Var}(T(H, G_n))}}$$

Question

Find necessary and sufficient conditions on G_n such that $Z(H, G_n) \rightarrow N(0, 1)$.

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Why 4-cycles?

 $\mathbb{E}\left[\mathcal{T}(K_2, G_n)^4\right] = 3 \cdot \# wedges + \# four-cycles.$

Not having many 4-cycles implies,

 $\mathbb{E}\left[Z(K_2, G_n)^4\right] \to 3 = \mathbb{E}\left[N(0, 1)^4\right].$

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Theorem (Bhattacharya, Fang, Yan 20')

Suppose that $c \geq 5$, $Z(K_3, G_n) \rightarrow N(0, 1)$ iff

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Theorem (Das, Himwich, Mani 23')

Suppose that $c \ge 32$, then for any $H, Z(H, G_n) \rightarrow N(0, 1)$ iff

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In fact, when c = 2, 3, 4 there exists graphs G_n such that

 $\mathbb{E}\left[Z(\mathcal{K}_3, \mathcal{G}_n)^4\right] \to 3 \text{ and } Z(\mathcal{K}_3, \mathcal{G}_n) \nrightarrow N(0, 1).$



For the rest of the talk we focus on c = 2 and $H = K_3$. **Goal:** Necessary and sufficient conditions for $Z(K_3, G_n) \rightarrow N(0, 1)$.

A useful representation: Let $X := \{X_v\}_{v \in V(G_n)}$ be *i.i.d.* Radamacher $(\frac{1}{2})$, then

$$Z(K_3, G_n) \propto \sum_{\substack{\{u, v, w\} \ ext{triangle}}} X_v X_u + X_v X_w + X_u X_w.$$

Question

Let $P : \mathbb{R}^{|V|} \to \mathbb{R}$ be a (quadratic, homogeneous) polynomial. When is P(X) close to N(0, 1)? For the rest of the talk we focus on c = 2 and $H = K_3$. **Goal:** Necessary and sufficient conditions for $Z(K_3, G_n) \rightarrow N(0, 1)$.

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Theorem (Invariance Principle – Mossel, O'Donnell, Oleszkiewicz 10')

Let $P : \mathbb{R}^n \to \mathbb{R}$ be a low-degree multi-linear polynomial, with low influences then for $G \sim N(0, I_n)$ and $X \sim \text{Rademacher}^{\otimes n}$,

 $P(X) \simeq P(G).$

Influences: The 'influence' of variable i is

Influence_i(P) := $\mathbb{E}\left[(\partial_i P(X))^2\right]$.

In other words, "Influence_i(P) = # of monomials containing x_i ".

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$$Z(K_3, G_n) \propto \sum_{\substack{\{u,v,w\} \ ext{triangle}}} X_v X_u + X_v X_w + X_u X_w.$$

So, $\text{Influence}_{\nu}(Z(K_3, G_n)) \propto \# \text{ of triangles containing } \nu$.

Vertex v is 'influential' if it appears in many triangles.

Invariance Principle + Fourth Moment Theorem imply:

No influential vertices $+ \mathbb{E} \left[Z(K_3, G_n)^4 \right] \rightarrow 3$ $\implies Z(K_3, G_n) \rightarrow N(0, 1)$ Recall:

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Influential Edges

Recall the bad example.



 $\{a,b\}$ is an **influential edge**, appear together in many triangles.

Theorem (Mani, M. 24')

Suppose that G_n has no influential edges and that $\mathbb{E}\left[Z(K_3, G_n)^4\right] \to 3$. Then,

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Theorem (Mani, M. 24')

Suppose that G_n contains an influential edge. Then

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Influential edges completely characterize the fourth moment theorem for $Z(K_3, G_n)$.

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Proof Sketch

Suppose that $\{a, b\}$ is an influential edge.



In the above picture,

 $P(X)|X_a \neq X_b \sim \text{constant.}$

A bit less immediate is that, by the LLN,

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So, in general

 $P(X) \simeq \text{Bernoulli} + \tilde{P}(X) \neq^{???} N(0,1).$

Suppose $\{a, b\}$ is the only influential edge and let

 $M := #\{ \text{triangles containing } \{a, b\} \}.$

By the Invariance Principle

 $\sum_{\substack{\{u,v,w\}\\\text{triangle}}} X_v X_u + X_v X_w + X_u X_w = M X_a X_b + P(X) \simeq M X_a X_b + P(G).$

and

$$Z(K_3, G_n) \simeq \frac{MX_aX_b + P(G)}{\sigma} = \text{Bernoulli} + \tilde{P}(G),$$

with \tilde{P} quadratic and $\operatorname{Var}(\tilde{P}(G)) \leq 1$.

$Z(K_3, G_n) = \text{Bernoulli} + \tilde{P}(G), \tilde{P} \text{ quadratic.}$ Only two possibilities for the tails of $\tilde{P}(G)$.

Case I: $\tilde{P}(G)$ has strictly exponential tails. In that case, Bernoulli + $\tilde{P}(G) \neq N(0, 1)$.

Case II: $\tilde{P}(G)$ has better than exponential tails. In that case, $\tilde{P}(G)$ is actually sub-Gaussian. Moreover,

 $\tilde{P}(G) \stackrel{\text{law}}{=} \sum \lambda_i (G_i^2 - 1),$

with max_i $\lambda_i = o(1)$. So, by the CLT

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Bernoulli + $\tilde{P}(G)$ = Gaussian Mixture $\neq N(0, 1)$.

- $Z(H, G_n)$ is a polynomial of degree at most r.
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- Can still prove a a fourth moment theorem for polynomials of the form $Z(H, G_n)$.
- Same upper bounds involving influential edges hold.

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Different Sub-Graphs

What about *non-triangle* monochromatic counts? Suppose |H| = r.

Lower Bounds:

- Can separate the influential vertices.
- Leads to a mixture with a degree r Gaussian form.

 $Z(H, G_n) \simeq \operatorname{Bernoulli} P_{r-2}(G) + \cdots + P_r(G).$

- There is a taxonomy of different tail behaviors for $P_r(G)$, as $e^{-t^{2\ell}}$ for $\ell = 1, \frac{1}{2}, \dots, \frac{1}{r}$.
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In particular, if a polynomial in Gaussian variables has approximately sub-Gaussian tails, is it approximately Gaussian?

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Let c < c'. Suppose that a CLT holds for $Z_c(H, G_n)$. Does this imply that a CLT holds for $Z_{c'}(H, G_n)$ as well?

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