Uniform spanning tree and limits of dense graphs

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# Limits of dense graph sequences

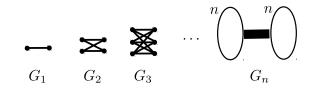
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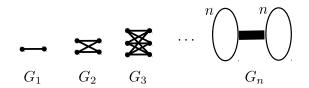
idea: convergence notion for sequences of finite graphs compactification of the space of finite graphs  $\Rightarrow$ ... graphons symmetric Lebesgue-m. functions  $\Omega^2 \rightarrow [0, 1]$ Why? same story as with  $\mathbb{Q}$  vs  $\mathbb{R}$ : only the latter allows reasonable e.g. variational and integral calculus for example  $\operatorname{argmin}(x^3 - 2x)$ 

Graphons



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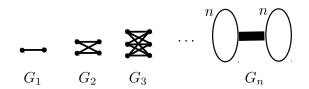
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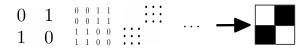
Represent these graphs by their adjacency matrices:



# Graphons



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... works if you do things the right way. But, ...



In general Szemerédi's Regularity Lemma can be used to determine "the right way" of ordering the vertices.

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if  $G \approx W$  then

$$\frac{1}{6}\sum_{i}\sum_{j}\sum_{k}A_{i,j}A_{j,k}A_{k,i}\approx\frac{n^{3}}{6}\cdot\int_{x}\int_{y}\int_{z}W(x,y)W(y,z)W(z,x)$$

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if  $G \approx W$  then

$$MAXCUT(G) \approx n^2 \cdot \sup_{\Omega = X \sqcup Y} \int_{x \in X} \int_{y \in Y} W(x, y)$$

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**Case study: UST in the complete graph**  $K_n$  $|\mathcal{T}(K_n)| = n^{n-2}$  (Cayley's formula)

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Quiz question:  $T \sim UST(K_n)$ . How many leaves does T have? (a)  $\log_2 n$ (b)  $\sqrt{\frac{2}{\pi}} \cdot \sqrt{n}$ (c)  $e^{-1}n$ (d)  $\frac{n}{2}$ 

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And what about vertices of degree  $2, 3, \ldots$ ? Frequencies of larger balls? (linear scaling! / local statistics)

And what about if  $G \neq K_n$ ? Continuity with respect to the cut-distance?

### Main Theorem

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**Main Theorem** Suppose that G is a connected graph,  $G \approx W$ , where W is a nondegenerate graphon. Then we know stuff.

In this sketch of proof: number of leaves of UST(G).

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$$\approx \mathbb{P} \left[ 0 = Poisson\left(\sum_{u} \frac{A_{u,v}}{\deg_{G}(u)}\right) \right] = \exp\left(-\sum_{u} \frac{A_{u,v}}{\deg_{G}(u)}\right)$$

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ratio of leaves in UST(G) 
$$\approx \frac{1}{n} \sum_{v} \exp\left(-\sum_{u} \frac{A_{u,v}}{\deg_{G}(u)}\right)$$
  
 $\approx \int_{x} \exp\left(-\int_{y} \frac{W(x,y)}{\deg_{W}(y)}\right)$