

A first intermediate class with limit object

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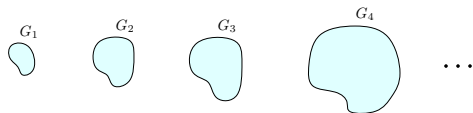
STRUCO Meeting on Distributed Computing and Graph Theory
— Pont-à-Mousson — November 2013



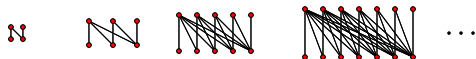
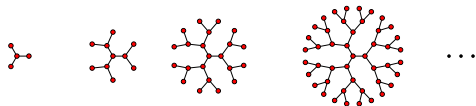
State of the art



Limit objects



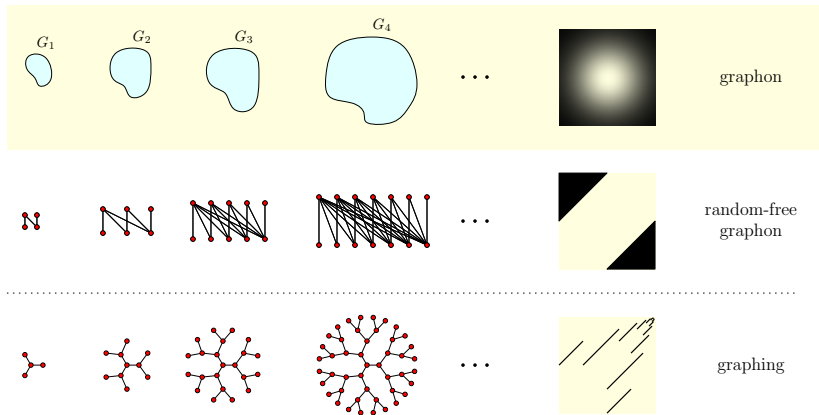
graphon

random-free
graphon

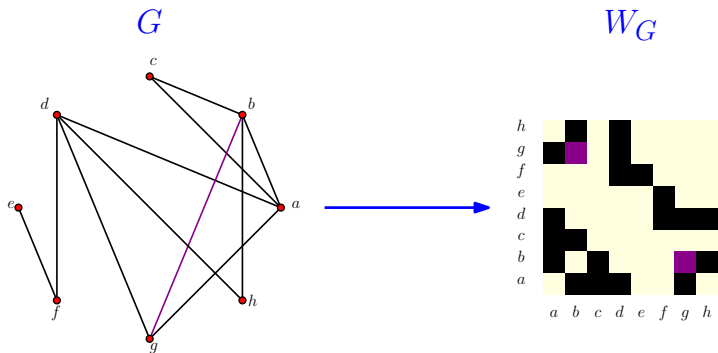
graphing



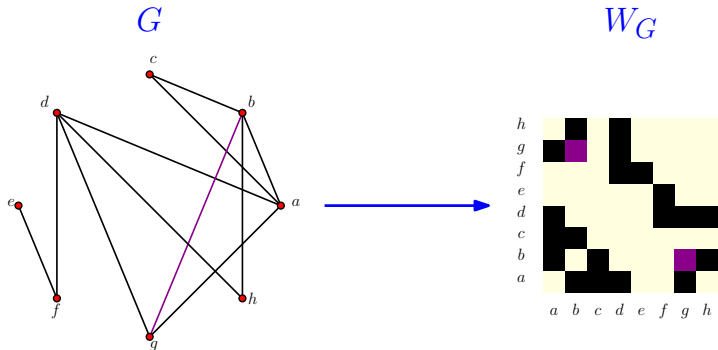
Limit objects: dense case



Graphons



Graphons

 W_{G_1}  W_{G_2}  W_{G_3} 

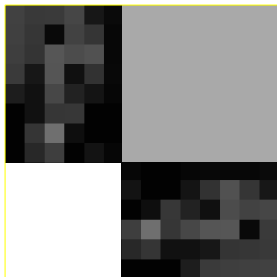
...

 W_{G_n} 

...

 W 

Szemerédi partitions



Regularity Lemma

$$\forall V'_i \subseteq V_i \quad \forall V'_j \subseteq V_j$$

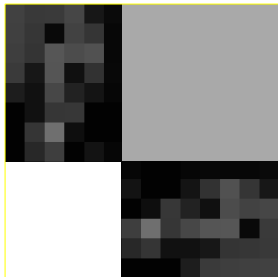
$$|V'_i| > \epsilon |V_i| \text{ and } |V'_j| > \epsilon |V_j|$$

$$\Downarrow$$

$$|\text{dens}(V'_i, V'_j) - \text{dens}(V_i, V_j)| < \epsilon$$



Szemerédi partitions



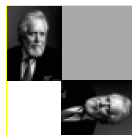
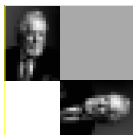
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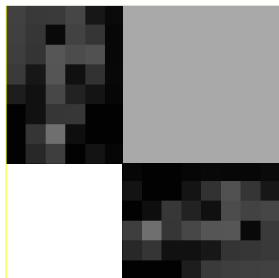
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$\epsilon \rightarrow 0$



Szemerédi partitions



Regularity Lemma

$$\forall V'_i \subseteq V_i \quad \forall V'_j \subseteq V_j$$

$$|V'_i| > \epsilon |V_i| \text{ and } |V'_j| > \epsilon |V_j|$$

$$\Downarrow$$

$$|\text{dens}(V'_i, V'_j) - \text{dens}(V_i, V_j)| < \epsilon$$



L-convergence

- Convergence of δ_{\square} or of *Lovász profile*

$$t(F, G_n) = \frac{\text{hom}(F, G_n)}{|G_n|^{|F|}}.$$

- Limit as a *graphon* (Lovász–Szegedy)

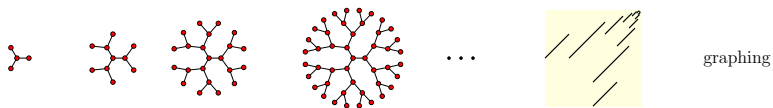
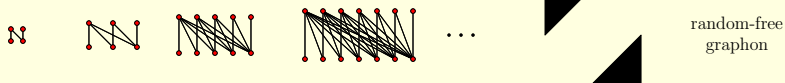
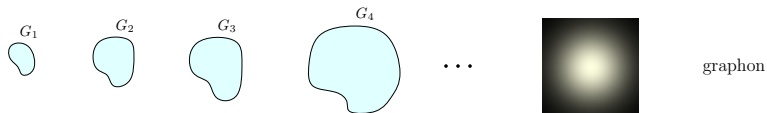
symmetric $W : [0, 1] \times [0, 1] \rightarrow [0, 1]$

(up to weak-equivalence)

- Limit as an *exchangeable random infinite graph* (Aldous–Hoover–Kallenberg, Diaconis–Janson).



Limit objects: random-free case



Random-free graphons & Borel graphons

Definition

A graphon is *random-free* if it is a.e. $\{0, 1\}$ -valued.

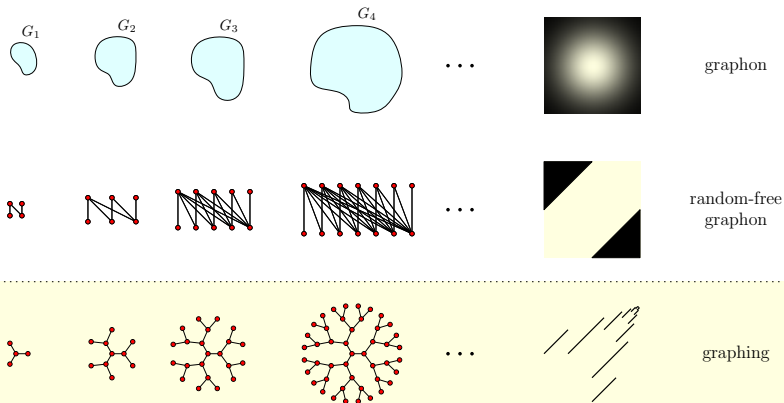
A *Borel graph* is a graph on a standard probability space, whose edge set is measurable.

Connections with ...

- Vapnik–Chervonenkis dimension (Lovász-Szegedy)
- δ_1 -metric (Pikhurko)
- entropy (Aldous, Janson, Hatami & Norine)
- class speed (Chatterjee, Varadhan)



Limit objects: bounded degree case



Bounded degree graphs: BS-convergence

- Convergence of

$$\frac{|\{v, B_d(G_n, v) \simeq (F, r)\}|}{|G_n|}.$$

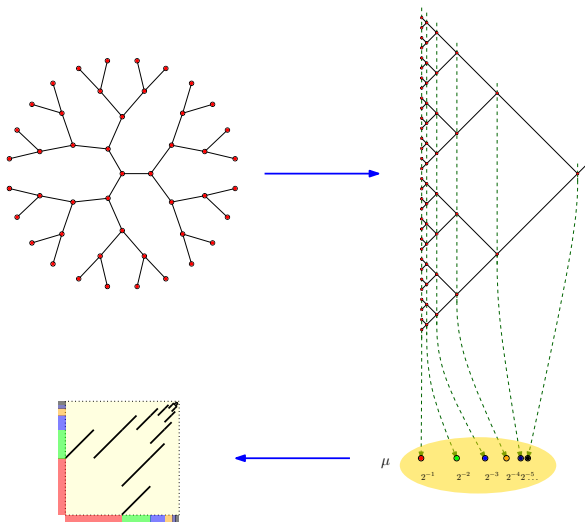
- Limit as a *graphing* = Borel graph satisfying the *Mass Transport Principle* (Aldous–Lyons, Elek)

$$\forall A, B \in \Sigma \quad \int_A d_B(x) d\nu(x) = \int_B d_A(x) d\nu(x).$$

- Limit as a *unimodular distribution on rooted connected countable graphs* (Benjamini–Schramm).



BS-convergence



Resume

Dense

L-convergence

conv. of $\frac{\text{hom}(F, G_n)}{|G_n|^{|F|}}$

Graphon

Exchangeable random
infinite graph

edge density/regularity

Bounded degree

BS-convergence

conv. of $\frac{|\{v, B_d(G_n, v) \simeq (F, r)\}|}{|G_n|}$

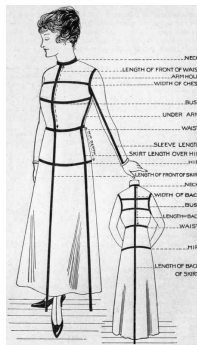
Graphing

Unimodular distribution of
rooted connected
countable graphs

structure



More statistics



Probabilistic approach of properties

Definition (Stone pairing)

Let ϕ be a first-order formula with p free variables and let $G = (V, E)$ be a graph.

The *Stone pairing* of ϕ and G is

$$\langle \phi, G \rangle = \Pr(G \models \phi(X_1, \dots, X_p)),$$

for independently and uniformly distributed $X_i \in V$.

That is:

$$\langle \phi, G \rangle = \frac{|\{(v_1, \dots, v_p) \in V^p : G \models \phi(v_1, \dots, v_p)\}|}{|V|^p},$$



Structural Limits

Definition

A sequence (G_n) is **FO-convergent** if, for every $\phi \in \text{FO}$, the sequence $\langle \phi, G_1 \rangle, \dots, \langle \phi, G_n \rangle, \dots$ is convergent.

In other words, (G_n) is FO-convergent if, for every first-order formula $\phi \in \text{FO}$, the probability that G_n satisfies ϕ for a random assignment of the free variables converges.



Structural Limits

Definition

Let X be a fragment of FO.

A sequence (G_n) is *X -convergent* if, for every $\phi \in X$, the sequence $\langle \phi, G_1 \rangle, \dots, \langle \phi, G_n \rangle, \dots$ is convergent.

In other words, (G_n) is X -convergent if, for every first-order formula $\phi \in X$, the probability that G_n satisfies ϕ for a random assignment of the free variables converges.



Special Fragments

QF Quantifier free formulas L-limits

FO₀ Sentences Elementary limits

FO^{local} Local formulas (BS-limits)

FO All first-order formulas FO-limits



Structural Limits

Boolean algebra $\mathcal{B}(X)$	Stone Space $S(\mathcal{B}(X))$
Formula ϕ	Continuous function f_ϕ
Vertices v_1, \dots, v_p, \dots	Type T of v_1, \dots, v_p, \dots
Graph G	statistics of types =probability measure μ_G
$\langle \phi, G \rangle$	$\int f_\phi(T) \, d\mu_G(T)$
X -convergent (G_n)	weakly convergent μ_{G_n}
$\Gamma = \text{Aut}(\mathcal{B}(X))$	Γ -invariant measure



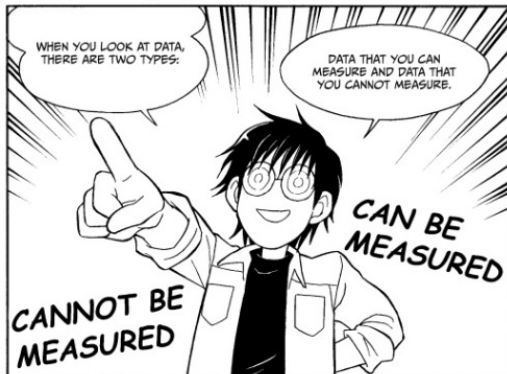
Modelings



Modelings

Definition

A *modeling* \mathbf{A} is a graph on a standard probability space s.t. every first-order definable set is **measurable**.



From "Manga Guide to Statistics", Shin Takahashi, 2008



Basic interpretations

$$G = (V, E) \mapsto I(G) = (V, E')$$

$$E' = \{(x, y) : G \models \theta(x, y)\}.$$

Examples

$$x \not\sim y \longrightarrow I(G) = \overline{G}$$

$$(x \sim y) \vee (\exists z (x \sim z) \wedge (z \sim y)) \longrightarrow I(G) = G^2$$



Basic interpretations

$$G = (V, E) \mapsto I(G) = (V, E')$$

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Properties

$$\exists I^* : \text{FO} \rightarrow \text{FO}, \quad \langle \phi, I(G) \rangle = \langle I^*(\phi), G \rangle$$



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$$G_n \text{ is FO-convergent} \implies I(G_n) \text{ is FO-convergent.}$$



Basic interpretations

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Properties

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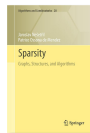
$$G_n \xrightarrow{\text{FO}} \mathbf{A} \implies I(G_n) \xrightarrow{\text{FO}} I(\mathbf{A}).$$



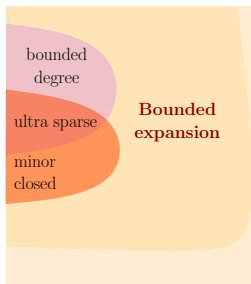
Modelings as FO-limits?

Theorem (Nešetřil, POM 2013)

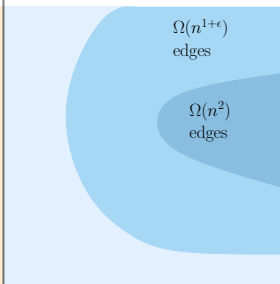
If a **monotone** class \mathcal{C} has modeling FO-limits then the class \mathcal{C} is **nowhere dense**.



Nowhere dense

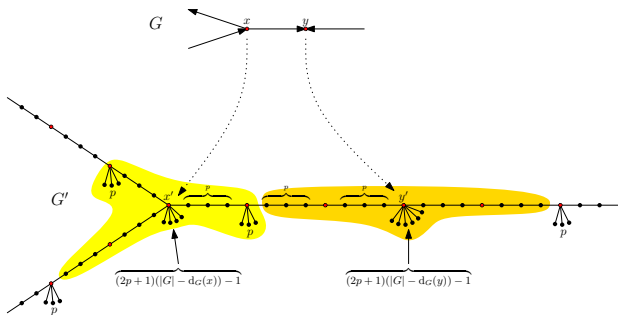


Somewhere dense



Proof (sketch)

- Assume \mathcal{C} is **somewhere dense**. There exists $p \geq 1$ such that $\text{Sub}_p(K_n) \in \mathcal{C}$ for all n ;
- For an oriented graph G , define $G' \in \mathcal{C}$:



- \exists **basic interpretation** I , such that for every graph G , $I(G') \cong G[k(G)] \stackrel{\text{def}}{=} G^+$, where $k(G) = (2p+1)|G|$.



Proof (sketch)

$$\begin{array}{ccc} G_n & \xrightarrow{L} & 1/2 \\ \vdots & & \\ G'_n & \in \mathcal{C} & \end{array}$$



Proof (sketch)

$$G_n \xrightarrow{L} 1/2$$

$$G'_n \xrightarrow{FO} \mathbf{A}$$



Proof (sketch)

$$\begin{array}{ccc} G_n & \xrightarrow{L} & 1/2 \\ G'_n & \xrightarrow{\text{FO}} & \mathbf{A} \\ I \downarrow & & \downarrow I \\ G_n^+ & \xrightarrow{\text{FO}} & I(\mathbf{A}) \end{array}$$



Proof (sketch)

$$\begin{array}{ccc}
 G_n & \xrightarrow{L} & 1/2 \\
 G'_n & \xrightarrow{FO} & \mathbf{A} \\
 I \downarrow & & \downarrow I \\
 G_n^+ & \xrightarrow{FO} & I(\mathbf{A}) \\
 & \Downarrow & \\
 G_n^+ & \xrightarrow{L} & W_{I(\mathbf{A})}
 \end{array}$$

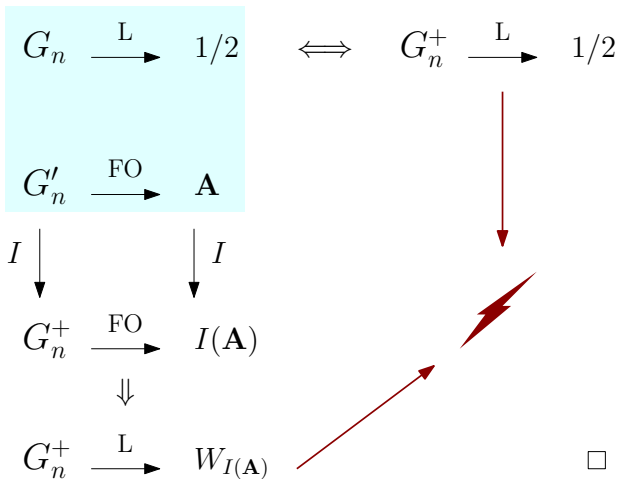


Proof (sketch)

$$\begin{array}{ccc}
 G_n & \xrightarrow{L} & 1/2 \\
 \Leftrightarrow & & \\
 G_n^+ & \xrightarrow{L} & 1/2 \\
 \\
 G'_n & \xrightarrow{FO} & \mathbf{A} \\
 \\
 I \downarrow & & \downarrow I \\
 G_n^+ & \xrightarrow{FO} & I(\mathbf{A}) \\
 \Downarrow & & \\
 G_n^+ & \xrightarrow{L} & W_{I(\mathbf{A})}
 \end{array}$$



Proof (sketch)



Modelings as FO-limits?

Theorem (Nešetřil, POM 2013)

If a **monotone** class \mathcal{C} has modeling FO-limits then the class \mathcal{C} is **nowhere dense**.

Conjecture (Nešetřil, POM)

Every nowhere dense class has modeling FO-limits.

- true for bounded degree graphs (Nešetřil, POM 2012)
- true for colored bounded height trees (Nešetřil, POM 2013)
- true for bounded tree-depth graphs (Nešetřil, POM 2013)



Small trees, and more



Are star forests easy?

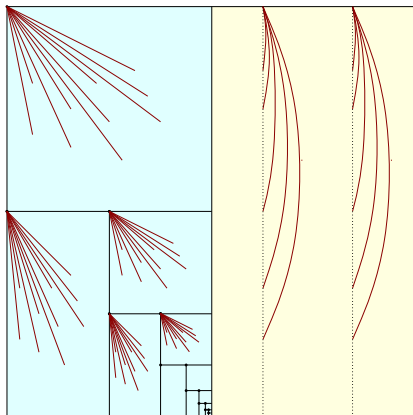
$$G_n = \overbrace{S_{2^{2^n}(2^{-1}+2^{-n})} + \cdots + S_{2^{2^n}(2^{-i}+2^{-n})} + \cdots + S_{2^{2^n}(2^{-2^n}+2^{-n})}}^{2^n \text{ stars}}$$



Are star forests easy?

2^n stars

$$G_n = \overbrace{S_{2^{2^n}(2^{-1}+2^{-n})} + \cdots + S_{2^{2^n}(2^{-i}+2^{-n})} + \cdots + S_{2^{2^n}(2^{-2^n}+2^{-n})}}$$



Rooted colored trees with height $\leq t$

(proof by induction on t)

1. Cut the tree into pieces via basic interpretation



Rooted colored trees with height $\leq t$

(proof by induction on t)

1. **Cut the tree** into pieces via basic interpretation
2. Isolate big components and group small components into a residual tree (**Comb Lemma**)



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(proof by induction on t)

1. **Cut the tree** into pieces via basic interpretation
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3. **Reduce to FO_1** -convergence for residual trees



Rooted colored trees with height $\leq t$

(proof by induction on t)

1. Cut the tree into pieces via basic interpretation
2. Isolate big components and group small components into a residual tree (Comb Lemma)
3. Reduce to FO_1 -convergence for residual trees
4. Consider the limit probability measure μ on $S(\mathcal{B}(\text{FO}_1))$



Rooted colored trees with height $\leq t$

(proof by induction on t)

1. **Cut the tree** into pieces via basic interpretation
2. Isolate big components and group small components into a residual tree (**Comb Lemma**)
3. **Reduce to FO_1** -convergence for residual trees
4. Consider the **limit probability measure μ** on $S(\mathcal{B}(\text{FO}_1))$
5. **Pullback μ** to a suitable universal measurable rooted tree and check that this actually defines a modeling FO-limit



Rooted colored trees with height $\leq t$

(proof by induction on t)

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6. Use induction to handle big components and put everything together (Merging Lemma)



Rooted colored trees with height $\leq t$

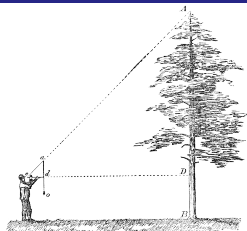
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6. Use induction to handle big components and put everything together (Merging Lemma)
7. Glue the components via basic interpretation



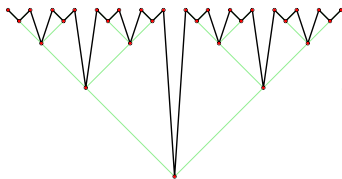
Tree-depth

Definition



The *tree-depth* $td(G)$ of a graph G is the minimum height of a rooted forest Y s.t.

$$G \subseteq \text{Closure}(Y).$$



$$td(P_n) = \log_2(n + 1)$$



Tree-depth at most t

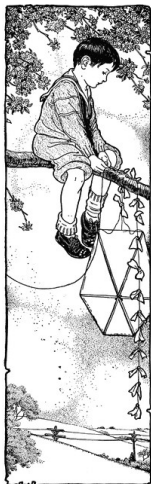
- Let (G_n) be an FO-convergent sequence of graphs with tree-depth $\leq t$.
- There is a basic interpretation I and rooted colored trees Y_n with height $\leq t + 1$ such that $G_n = I(Y_n)$.
- By compactness, there is a **subsequence** $(Y_{f(n)})_{n \in \mathbb{N}}$, which is FO-convergent.
- Let $Y_{f(n)} \xrightarrow{\text{FO}} \mathbf{A}$.
- Then $G_n \xrightarrow{\text{FO}} I(\mathbf{A})$.



Colored Trees

- Reduction (mod countable) to countably many essentially connected sequences and a residual sequence, by cutting the trees and taking subsequence;
- For a residual sequence, construction via Stone space;
- For an essentially connected sequence, inductive construction of a modeling limit.





Thank you for your
attention.

