

# Modeling Limits

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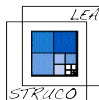
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## Limits of Structures

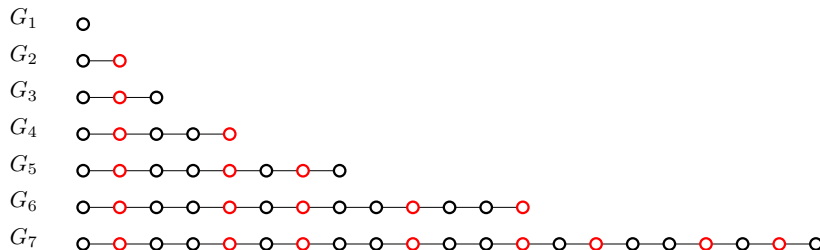


# Classical Graph Limits

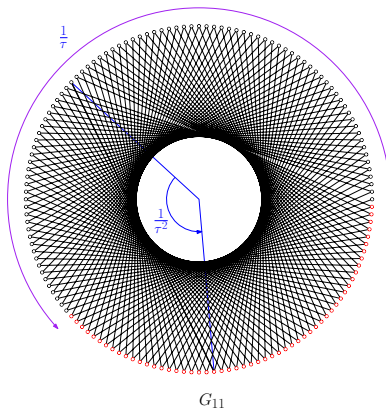
	Left limits	Local limits
assumption	Dense ( $m = \Omega(n^2)$ )	Sparse (bounded $\Delta$ )
sample	Isomorphism type of $G[X_1, \dots, X_p]$	Isomorphism type of $B_r(G, X)$
distribution	Exchangeable random graph (Aldous '81, Hoover '79)	Unimodular distribution (Benjamini-Schramm '01)
analytic limit object	Graphon measurable $W : [0, 1]^2 \rightarrow [0, 1]$ (Lovász <i>et al.</i> '06)	Graphing $d$ measure preserving involutions (Elek '07)



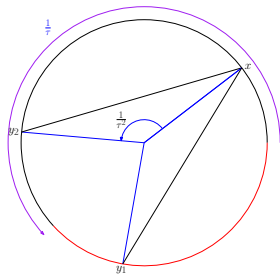
# Fibonacci Sequence



# Fibonacci Sequence



# Fibonacci Sequence Local Limit



In  $\mathbb{R}/\mathbb{Z}$ :

$$x \sim y \iff x \equiv y \pm \frac{1}{\tau^2}$$

$$\text{Black}(x) \iff x \in \left[0, \frac{1}{\tau}\right]$$

Graphing: two views

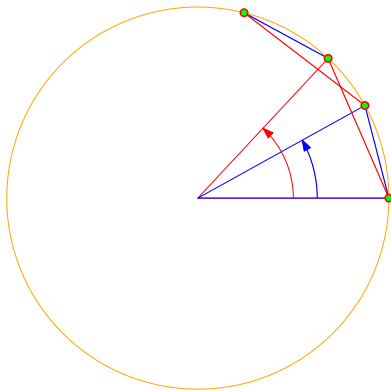
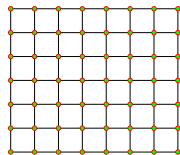
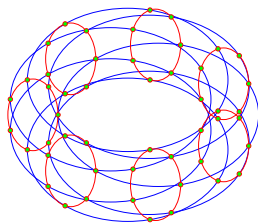
$D$  measure preserving  
Borel involutions  
 $f_1, \dots, f_d$

Borel graph + Mass Transport

$$\int_A \deg_B(v) dv = \int_B \deg_A(v) dv$$



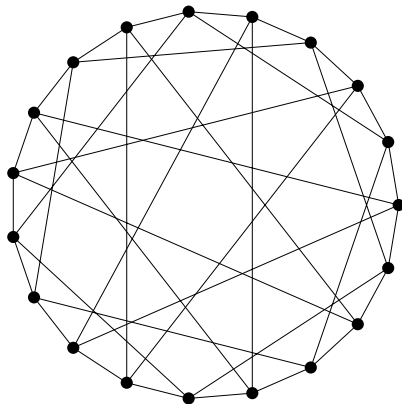
# Grids



$$x \in \mathbb{R}/\mathbb{Z} \quad x \mapsto \begin{cases} x \pm \alpha \\ x \pm \beta \end{cases}$$



# High-girth Regular Graphs



$$(x, y) \in (\mathbb{R}/\mathbb{Z}) \times (\mathbb{R}/\mathbb{Z}) \quad (x, y) \mapsto \begin{cases} (x, y) \pm (\alpha, 0) \\ (x, y) \pm (\beta, \beta) \end{cases}$$





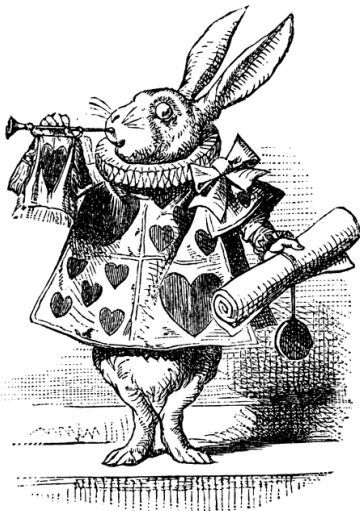
# How to handle unbounded degrees?

Instead of

the **isomorphism** type of the  
**radius  $d$  ball** around  $v$ ,

consider

the **local type** of  $v$   
for  **$d$ -local formulas**.



# Local Formulas

## Definition

A formula  $\phi$  is *local* if there exists  $r$  such that satisfaction of  $\phi$  only depends on the  $r$ -neighborhood of the free variables:

$$G \models \phi(v_1, \dots, v_p) \iff G[N_r(\{v_1, \dots, v_p\})] \models \phi(v_1, \dots, v_p).$$

## Definition

A sequence  $(G_n)$  is **FO<sub>1</sub><sup>local</sup>-convergent** if, for every local formula  $\phi(x)$  with one free variable, the probability that  $G_n$  satisfies  $\phi(v)$  for random  $v \in V(G_n)$  converges as  $n \rightarrow \infty$ .

That is: convergence of

$$\langle \phi, G_n \rangle := \frac{|\{v : G_n \models \phi(v)\}|}{|G_n|}.$$



# Stone pairing

Let  $\phi$  be a **first-order formula** with  $p$  free variables and let  $G$  be a graph (or a structure with countable signature).

The *Stone pairing* of  $\phi$  and  $G$  is

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

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

That is:

$$\langle \phi, G \rangle = \frac{|\phi(G)|}{|G|^p}.$$

## Remark

If  $\phi$  is a **sentence** then  $\langle \phi, G \rangle \in \{0, 1\}$ .



# Structural Limits

## Definition

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.

FO <sub>0</sub>	Sentences	Elementary limits
QF	Quantifier free formulas	Left limits
FO <sub>1</sub> <sup>local</sup>	Local formulas with 1 free variable	Local limits
FO <sub>1</sub>	Formulas with 1 free variable	FO <sub>1</sub> -limits
FO <sup>local</sup>	Local formulas	FO <sup>local</sup> -limits
FO	All first-order formulas	FO-limits

## Remark (Sequential compactness)

Every sequence has an  $X$ -convergent subsequence.



# Modelings

## Definition

A *totally Borel graph* is a graph on a standard Borel space s.t. every first-order definable set is Borel.

A *modeling*  $\mathbf{A}$  is totally Borel graph with a probability measure  $\nu_{\mathbf{A}}$ .

The Stone pairing extends to modelings:

$$\langle \phi, \mathbf{A} \rangle = \nu_{\mathbf{A}}^{\otimes p}(\phi(\mathbf{A})) = \Pr_{\nu_{\mathbf{A}}}[\mathbf{A} \models \phi(X_1, \dots, X_p)].$$



# Modeling $\text{FO}_1^{\text{local}}$ -Limits

## Theorem (Nešetřil, OdM 2016+)

Every  $\text{FO}_1^{\text{local}}$ -convergent sequence  $(G_n)_{n \in \mathbb{N}}$  of graphs (or structures with countable signature) has a modeling  $\text{FO}_1^{\text{local}}$ -limit  $\mathbf{L}$ .



# Modeling $\text{FO}_1$ -Limits

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+Sentences:

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Modeling  $\text{FO}_1^*$ -Limits

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+  $\forall \phi \in \text{FO}$  s.t.  $(\langle \phi, G_n \rangle)_{n \in \mathbb{N}}$  converges it also holds

$$\langle \phi, \mathbf{L} \rangle = 0 \quad \Longleftrightarrow \quad \lim_{n \rightarrow \infty} \langle \phi, G_n \rangle = 0.$$

We denote this by

$$G_n \xrightarrow{\text{FO}_1^*} \mathbf{L}.$$





**Step 1:** non standard construction (ultraproduct+Loeb measure)  
of a model  $\mathbf{M}$  (not on a standard Borel space, only Fubini-like  
properties)



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**Step 2:** let  $T$  be the sentences (in Friedman's  $\mathcal{L}(\mathbf{Q}_m)$  logic) of the form

$$\begin{cases} (Q_m x_1) \dots (Q_m x_p) \phi(x_1, \dots, x_p) & \text{if } \lim_{n \rightarrow \infty} \langle \phi, G_n \rangle > 0 \\ \neg(Q_m x_1) \dots (Q_m x_p) \phi(x_1, \dots, x_p) & \text{if } \lim_{n \rightarrow \infty} \langle \phi, G_n \rangle = 0 \end{cases}$$

By Friedman-Steinhorn theorem,  $T$  has a totally Borel model  $\mathbf{L}$ .



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By Friedman-Steinhorn theorem,  $T$  has a totally Borel model  $\mathbf{L}$ .

**Step 3:** Adjust the probability measure.

$$\pi \Leftarrow \pi_r, \quad \text{where } \pi_r(X) = \sum_{i \in \lambda(\theta_i^r(\mathbf{L})) \neq 0} \frac{\lambda(X \cap \theta_i^r(\mathbf{L}))}{\lambda(\theta_i^r(\mathbf{L}))} \lim_{n \rightarrow \infty} \langle \theta_i^r, G_n \rangle.$$



## FO-limits?



# Convergence of Bounded Degree Graphs

For a sequence  $(G_n)_{n \in \mathbb{N}}$  of graphs with degree  $\leq d$  the following are equivalent:

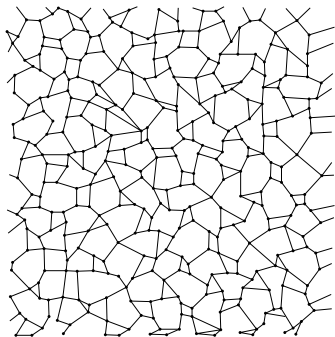
1. the sequence  $(G_n)_{n \in \mathbb{N}}$  is **local convergent**;
2. the sequence  $(G_n)_{n \in \mathbb{N}}$  is  **$\text{FO}_1^{\text{local}}$ -convergent**;
3. the sequence  $(G_n)_{n \in \mathbb{N}}$  is  **$\text{FO}^{\text{local}}$ -convergent**;

## Theorem (Nešetřil, OdM 2012)

Every **FO-convergent** sequences of graphs with bounded degrees has a graphing FO-limit.



# Residual Sequences



$\forall d \in \mathbb{N} :$

$$\lim_{n \rightarrow \infty} \sup_{v_n \in G_n} \frac{|N_{G_n}^d(v_n)|}{|G_n|} = 0.$$



$G_n \xrightarrow{\text{FO}} \mathbf{L} \iff G_n \xrightarrow{\text{FO}_1} \mathbf{L}$   
for a **residual** sequence  $(G_n)$ .

Theorem (Nešetřil, OdM 2016+)

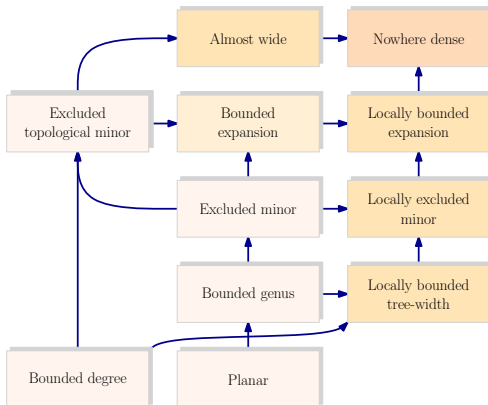
Every **residual FO-convergent** sequence  $(G_n)_{n \in \mathbb{N}}$  of graphs has a **modeling FO-limit**  $\mathbf{L}$ .



# Modeling limits?

## Theorem (Nešetřil, OdM 2013, 2017)

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



# Modeling limits for Nowhere dense?

## Conjecture (Nešetřil, OdM )

Every nowhere dense class has modeling FO-limits.

- true for **bounded degree graphs** (Nešetřil, OdM 2012)
- true for **bounded tree-depth graphs** (Nešetřil, OdM 2013)
- true for **trees** (Nešetřil, OdM 2016)
- true for **plane trees** and for graphs with **bounded pathwidth** (Gajarský, Hliněný, Kaiser, Král, Kupec, Obdržálek, Ordyniak, Tůma 2016)



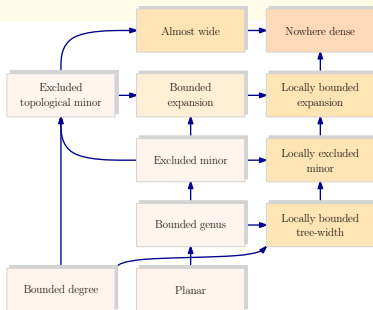
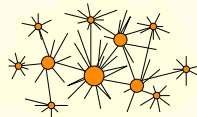


# Modeling Limits of Nowhere Dense Sequences

## Theorem (Nešetřil, OdM 2016)

A **hereditary** class of graphs  $\mathcal{C}$  is **nowhere dense** if and only if  $\forall d, \forall \epsilon > 0, \forall G \in \mathcal{C}, \exists S \subseteq G$  with  $|S| \leq N(d, \epsilon)$  such that

$$\sup_{v \in G-S} \frac{|N_{G-S}^d(v)|}{|G|} \leq \epsilon.$$



# Modeling Limits of Quasi-Residual Sequences

$(G_n)$  is **quasi-residual** if

$$\lim_{d \rightarrow \infty} \lim_{C \rightarrow \infty} \lim_{n \rightarrow \infty} \inf_{|S_n| \leq C} \sup_{v_n \in G_n - S_n} \frac{|N_{G_n - S_n}^d(v_n)|}{|G_n|} = 0.$$

$\Leftrightarrow$   $\epsilon$ -close to residual by removing  $\leq C(\epsilon)$  vertices.

Theorem (Nešetřil, OdM 2016+)

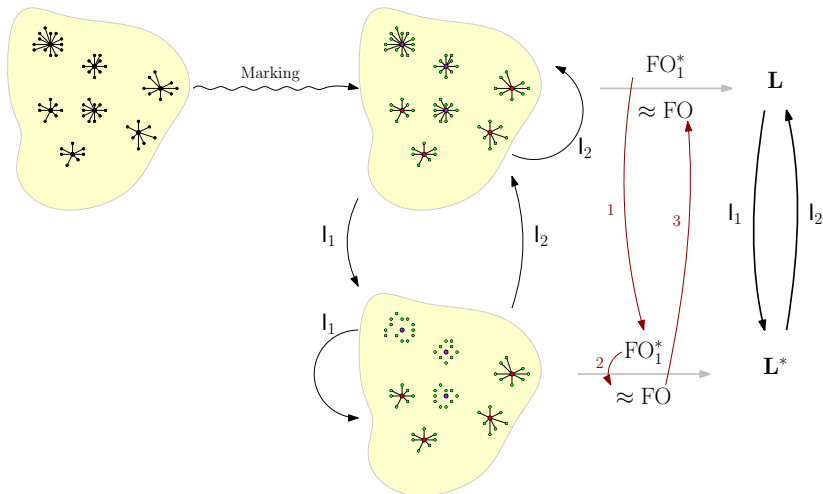
Every **FO-convergent** **quasi-residual** sequence of graphs has a **modeling FO-limit**.

Corollary

A **monotone** class  $\mathcal{C}$  is **nowhere dense** if and only if every **FO-convergent** sequence of graphs in  $\mathcal{C}$  has a **modeling FO-limit**.



# Sketch of the Proof



## Going further



# Local-Global Convergence

- Defined from **colored neighborhood metric** (Bollobás and Riordan '11)

Definition (Local-Global Convergence for graphs with bounded degree; Hatami, Lovász, Szegedy '13)

A sequence of finite graphs  $(G_n)_{n \in \mathbb{N}}$  with all degrees at most  $d$  is called **locally-globally convergent** if for every  $r, k \geq 1$ , the sequence  $(Q_{G_n, r, k})_{n \in \mathbb{N}}$  of all  $k$  colorings of  $G_n$  converges in the **Hausdorff distance** inside the compact metric space of probability distributions over isomorphism types of rooted graphs with radius  $r$  and maximum degree  $d$  with total variation distance.



# Distributional Limit for $X$ -convergence

## Theorem (Nešetřil, OdM '12)

There are maps  $G \mapsto \mu_G$  and  $\phi \mapsto k(\phi)$ , such that

- $G \mapsto \mu_G$  (injective if  $X \supseteq \text{QF}$  or  $\text{FO}_0$ )
- $\langle \phi, G \rangle = \int_S k(\phi) d\mu_G$
- A sequence  $(G_n)_{n \in \mathbb{N}}$  is  $X$ -convergent iff  $\mu_{G_n}$  converges weakly.

Thus if  $\mu_{G_n} \Rightarrow \mu$ , it holds

$$\int_S k(\phi) d\mu = \lim_{n \rightarrow \infty} \int_S k(\phi) d\mu_{G_n} = \lim_{n \rightarrow \infty} \langle \phi, G_n \rangle.$$

Note:  $\text{FO}_p \rightarrow \mathfrak{S}_p$ -invariance;  $\text{FO} \rightarrow \mathfrak{S}_\omega$ -invariance.



# Local-Global Convergence

## Definition (General Setting)

Let  $\sigma, \sigma^+$  be countable signature with  $\sigma \subseteq \sigma^+$ , and let  $X$  be a fragment of  $\text{FO}(\sigma^+)$ .

A sequence  $(\mathbf{A}_n)_{n \in \mathbb{N}}$  is  *$X$ -local global convergent* if the sequence of the sets

$$\Omega_{\mathbf{A}_n} = \{\mathbf{A}_n^+ : \text{Shadow}(\mathbf{A}_n^+) = \mathbf{A}_n\}$$

converges with respect to Hausdorff distance (based on Lévy-Prokhorov metric on probability distributions).



# Local-Global Convergence

## Alternate Setting

Let  $\sigma \subseteq \sigma^+$  and let  $X \subseteq \text{FO}$ .

A sequence is  $X$ -local global convergent if every  $X$ -convergent subsequence of lifts extends to a full  $X$ -convergent sequence of lifts.





# Properties

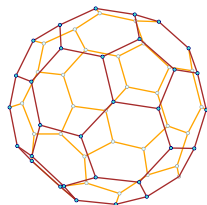
- (Using **Blaschke theorem**):

Every sequence  $(\mathbf{A}_n)_{n \in \mathbb{N}}$  has an  $X$ -local global convergent subsequence.

- $\text{FO}^{\text{local}}$ -local-global convergence with monadic lifts.

This is standard local-global convergence.

- graphings are still limits of graphs with bounded degrees  
(**Hatami, Lovász, and Szegedy '13**)
- allows mark of expander parts.



# Open Problems

1. What is the exact **threshold** for general modeling FO-limits?  
(Between  $\text{FO}_1^*$  and  $\text{FO}_4^{\text{local}}$ ; Conjecture:  $\text{FO}_1^*$ )
2. What version of the **Mass Transport Principle** for modeling FO-limits of nowhere dense graphs can we require?
3. What **hereditary class** of graphs have modeling FO-limits?  
(Conjecture: **Almost** interpretations of nowhere dense classes)
4. Do **local-global** convergent sequences of nowhere dense graphs have modeling FO-limits?  
(Almost! Conjecture: **Yes**; would extend **Hatami–Lovász–Szegedy '13**)





Thank you  
for your  
attention.

