#### Limits of sparse graph sequences

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Graph limit theories



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#### Graph limit theories

#### Limits of dense graph sequences~2004

Borgs, Chayes, Lovász, Razborov, Sós, Szegedy, Vesztergombi works for all graph sequences but trivial when  $e(G_n)/v(G_n)^2 \rightarrow 0$ .

note 
$$e(G_n) \leq {\binom{v(G_n)^2}{2}} \approx \frac{v(G_n)^2}{2}$$
.

 $\Rightarrow$  breakthroughs in graph theory (extremal GrTh, random graphs)  $\Rightarrow$  stimulated developements in Higher Order Fourier Analysis (Szegedy, Green–Tao, ...)

Limits of sparse graphs~2001, Benjamini–Schramm one needs to fix  $D \in \mathbb{N}$  and work in the category of graphs of maximum degree  $\leq D$ .

note 
$$e(G_n) \leq \frac{D}{2}v(G_n)$$

 $G_1, G_2, G_3, \ldots$  graphs with all the degrees are bounded by an absolute constant D.

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**Observation** Every sequence of uniformly degree-bounded graphs contains a convergent subsequence.

## Example: grids





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## Example: 3-regular trees



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Obtaining the 3-regular tree in the limit





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### The Aldous–Lyons conjecture



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### The Aldous-Lyons conjecture



If  $\mu$  is a limit distribution then sampling according to  $\mu$  and moving to a random neighbor must give the original law  $\mu$ (weighted by degrees)  $\Rightarrow$  unimodular distributions **Conjecture (Aldous–Lyons'07)** Every unimodular distribution can be obtained as a limit.

# Sofic groups (Gromov 1990)

A (finitely generated) group  $\Gamma = \langle S \rangle$  is **sofic** if the Dirac measure on the Cayley graph ( $\Gamma$ , S) can be approximated by finite graphs. (in the actual definition, one has to move to the category of edge-labelled directed graphs)



This definition does not depend on the choice of S.

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Alternative definition: subgroup of a metric ultraproduct of  $S_n$ 's **Gromov 1990:** It could perhaps be the case (?!) that every group is sofic???

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Elek-Szabó 2005: Every sofic group is hyperlinear,

Applications of soficity: equations in groups

 $\Gamma$ ...group,  $k_1, k_2, \ldots, k_n \in \mathbb{Z}, \gamma_1, \gamma_2, \ldots, \gamma_n \in \Gamma$ . We want to find a solution  $x \in \Gamma$ ,

$$\gamma_1 x^{k_1} \gamma_2 x^{k_2} \dots \gamma_n x^{k_n} = 1 .$$

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$$\alpha x \beta x^{-1} = 1$$
 when  $ord(\alpha) \neq ord(\beta)$ 

An equation is regular if  $\sum k_i \neq 0$ . Conjecture Any regular equation (in a group  $\Gamma$ ) has a solution over some extension  $\Lambda \supseteq \Gamma$ .

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**Theorem** True for hyperlinear (and thus also sofic) groups  $\Gamma$ . **Baby version** For each regular equation in a finite group  $\Gamma$  has a solution over some  $\Lambda \supseteq \Gamma$ .

**Proof**  $\Gamma \leq \mathbb{S}_n \leq O(n)$ , and we have Gerstenhaber–Rothaus'62: O(n) is algebraically close.

### Applications of soficity: group rings

**Conjecture (Kaplansky 1969):** For any group G and commutative field K, the group algebra K(G) is directly finite. That is  $ab = 1_K$  implies  $ba = 1_K$ .

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## Applications of soficity: group rings

**Conjecture (Kaplansky 1969):** For any group G and commutative field K, the group algebra K(G) is directly finite. That is  $ab = 1_K$  implies  $ba = 1_K$ . **Theorem (Elek–Szabó'04):** For any sofic group G and commutative field K, the group algebra K(G) is directly finite. That is  $ab = 1_K$  implies  $ba = 1_K$ .

#### An application in global analysis

**Theorem (Lück 1994, Abért, Thom, Virág 201?):** Let X be a finite connected simplicial complex. Let  $\pi_1(X) \ge \Gamma_1 \ge \Gamma_2 \ge \ldots$  be a chain of normal subgroups of finite index in  $\pi_1(X)$  with  $\bigcap_n \Gamma_n = 1$ , and let  $X_n = \tilde{X}/\Gamma_n$ . Then

$$\lim_{n} \frac{b_k(X_n)}{|\Gamma:\Gamma_n|} = \beta_k^{(2)}(X) .$$

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 $(\beta_k^{(2)} \dots k$ -th  $L^2$  Betti number)

### Bounded degrees

Why did we have to have all degrees  $\leq D$ ?

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Random rooted 2-balls  $G_1, G_2, G_3, \ldots$  have a weak limit, but a trivial one (total mass=0).

Maximum degree  $\leq D \Rightarrow$  finitely many *r*-balls  $\Rightarrow$  measure cannot "escape to infinity"

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Maximum degree  $\leq D \Rightarrow$  finitely many *r*-balls

 $\Rightarrow$  measure cannot "escape to infinity"

A sequence of probability measures  $\mu_1, \mu_2, \ldots$  on  $\mathcal{X}$  is **tight** if for every  $\epsilon > 0$  there exists a **finite**  $\mathcal{K} \subset \mathcal{X}$  such that  $\mu_n(\mathcal{K}) \ge 1 - \epsilon$ for all *n*.

**Lyons'07:** The concept of Benjamini–Schramm limit can be extended to sequences  $G_1, G_2, \ldots$  where for each  $r \in \mathbb{N}$ , the sequence  $\rho_r(G_1), \rho_r(G_2), \ldots$  is tight. AND NOT FURTHER

Ongoing work with Lukasz Grabowski & Oleg Pikhurko

#### Theorem (Elek'10)

The Aldous–Lyons conjecture holds for measures supported on bounded-degree trees.

**Theorem (Elek–Lippner'10)** (Borel Oracles Method) The matching ratio is Benjamini–Schramm continuous for bounded-degree graphs.

**Definition** A **graphing** is a unimodular Borel graph whose each degree is finite and bounded by an absolute constant  $D \in \mathbb{N}$ .

#### Theorem (Hatami–Lovász–Szegedy'13)

For every Benjamini–Schramm convergent sequence of graphs of degree  $\leq D$  there is a graphing that is its local-global limit.

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#### Theorem

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#### Theorem

For every Benjamini–Schramm convergent sequence of graphs of  $\frac{1}{\text{degree} \leq D}$  there is a graphing that is its local-global limit.

... and perhaps almost all of the theory can be extended

Erdős–Rényi random graph  $\mathbb{G}(n, p)$  (Erdős–Rényi, Gilbert, 1959): Take  $V(G) = \{1, ..., n\}$ . To randomly generate the edges, we put  $ij \in E(G)$  with probability p.

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Many interesting phenomena occur for C > 0 constant, and

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**Claim** Let C > 0 and let  $G_n \sim \mathbb{G}(n, C/n)$ . Almost surely  $(G_n)$  is Benjamini–Schramm convergent (and converges to a Galton–Watson branching process with parameter C).

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**Why important?** Questions from dynamical systems. Previously, more complicated model of random *D*-regular graphs.