

# Analytic representations of large discrete structures

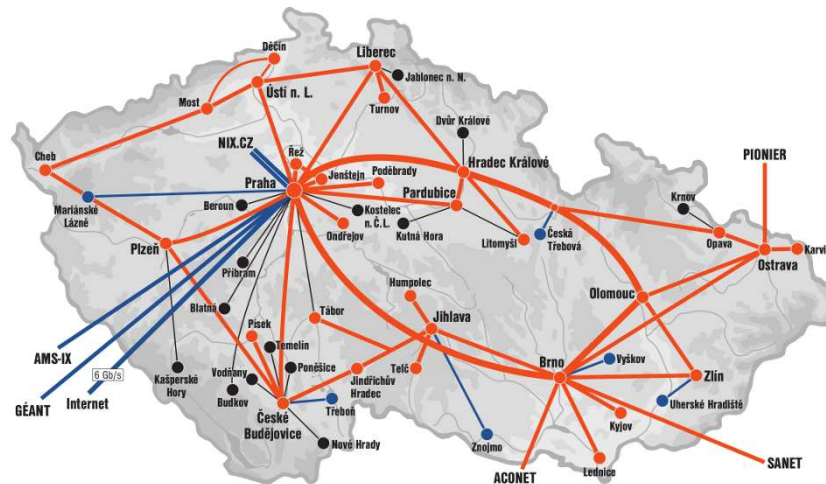
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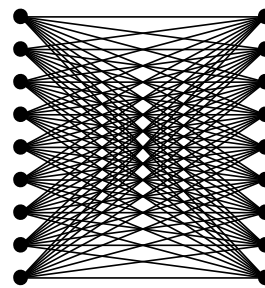
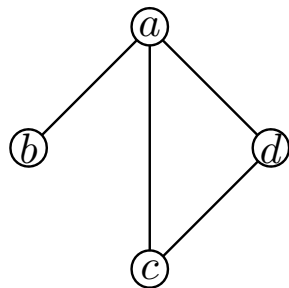
# NETWORKS

- nodes joined by links
- cities with roads
- public transportation
- internet connections
- facebook friendships



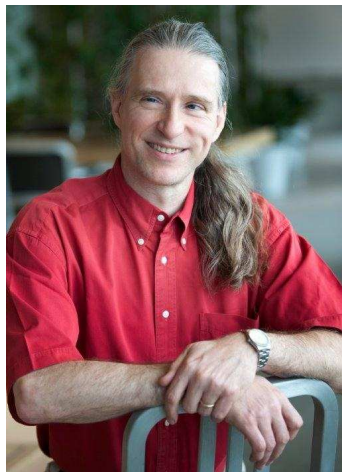
# GRAPHS

- **graph** is a pair  $(V, E)$   
 $V$  are **nodes** (vertices) and  $E \subseteq \binom{V}{2}$  are **edges**
- example:  $V = \{a, b, c, d\}$  and  $E = \{ab, ac, ad, cd\}$
- **algorithmic graph theory**  
shortest path, travelling salesperson problem, etc.



# LARGE GRAPHS

- The story starts in Microsoft Research around 2005...
- How can we represent and analyze large networks?



Borgs



Chayes



Lovász

# WHAT IS THE GOAL?

- representation of a large graph  
mathematical object “having” the same key parameters
- sampling  
generate a graph with the same key parameters
- robustness of the model  
the key parameters mutually interplay  
suitable to infer unobserved properties

# SPARSE VS. DENSE REGIME

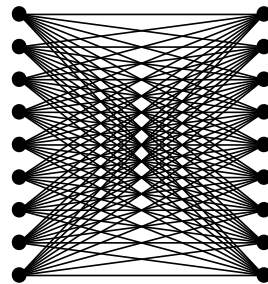
- tools different depending on the density
- **sparse graphs**  
constant number of edges per node (on average)  
computer science – most real world networks
- **dense graphs**  
positive proportion of node pairs are edges  
mathematics – extremal graph theory

# SPARSE REGIME

- poor local vs. global interaction
- Benjamini-Schramm convergence
- right convergence
- partition convergence
- local-global convergence
- large deviation convergence

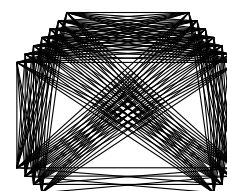
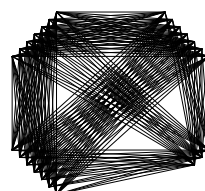
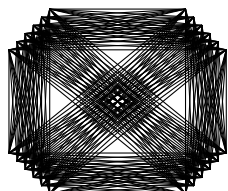
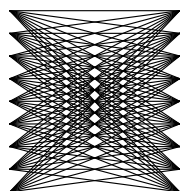
# DENSE REGIME

- Why should we care?  
extremal graph theory
- Mantel's Theorem (1907):  
maximum number of edges in a triangle-free graph  
important and difficult generalizations



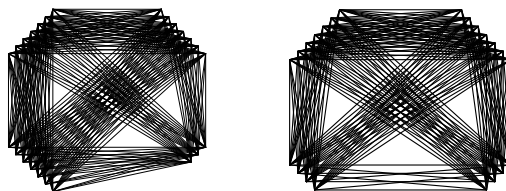
# EDGE VS. TRIANGLE PROBLEM

- Minimum density of  $K_3$  for a specific edge-density
- determined by Razborov (2008),  $K_{\alpha n, \dots, \alpha n, (1-k\alpha)n}$
- extensions by Nikiforov (2011) and Reiher (2016) for  $K_\ell$
- Pikhurko and Razborov (2017) gave extremal examples generally not unique, can be made unique by  $\overline{K_{2,1}} = 0$



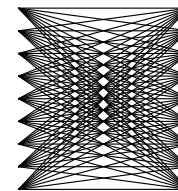
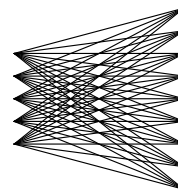
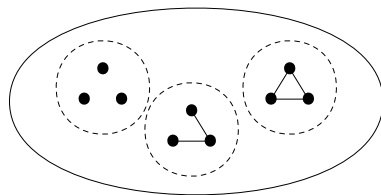
## MORE GENERAL PHENOMENON?

- Conjecture (Lovász 2008, Lovász and Szegedy 2011)  
Every finite feasible set  $H_i = d_i$ ,  $i = 1, \dots, k$ ,  
can be extended to a finite feasible set  
with an asymptotically unique structure.
- Theorem (Grzesik, K., Lovász Jr.): **FALSE**



# CONVERGENT GRAPH SEQUENCE

- $d(H, G) = \text{probability } |H|\text{-vertex subgraph of } G \text{ is } H$
- a sequence  $(G_n)_{n \in \mathbb{N}}$  of graphs is convergent if  $d(H, G_n)$  converges for every  $H$
- examples:  $K_n$ ,  $K_{\alpha n, n}$ , blow ups  $G[K_n]$   
Erdős-Rényi random graphs  $G_{n,p}$ , planar graphs
- extendable to other discrete structures



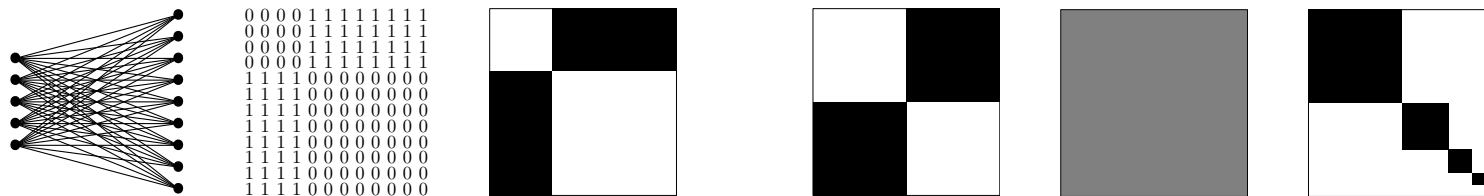
# REGULARITY METHOD

- developed by Endré Szemerédi  
Abel Prize 2012
- Regularity Decompositions  
every graph can be split into finitely  
many quasirandom pieces
- interplay between local and global
- property testing algorithms
- existence of arithmetic progressions  
in dense subsets of integers



# GRAPHONS

- a graph can be described by the **adjacency matrix**  
rows/columns  $\approx$  nodes, 0/1  $\approx$  adjacencies
- take a “continuous” adjacency matrix  
regularity decompositions, martingale convergence
- (local) graph densities  $\Rightarrow$  global structure
- in general, **all** graph densities required



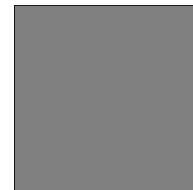
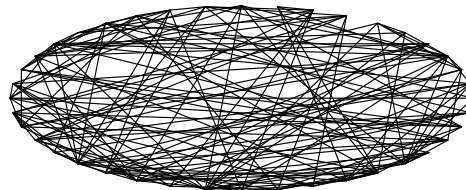
# QUASIRANDOM GRAPHS

- Thomason, and Chung, Graham and Wilson (1980's)

When does a graph look like a random graph?

Erdős-Rényi model  $G_{n,p}$ : include each edge with prob.  $p$

- a sequence  $G_i$  is quasirandom if  $d(H, G_i) \approx d(H, G_{n,p})$ 
  - $\Leftrightarrow G_i$  converges to the constant graphon  $W_p$
  - $\Leftrightarrow$  uniform edge density, cut sizes, spectral properties
  - $\Leftrightarrow h(K_2, G_i) \rightarrow p$  and  $h(C_4, G_i) \rightarrow p^4$



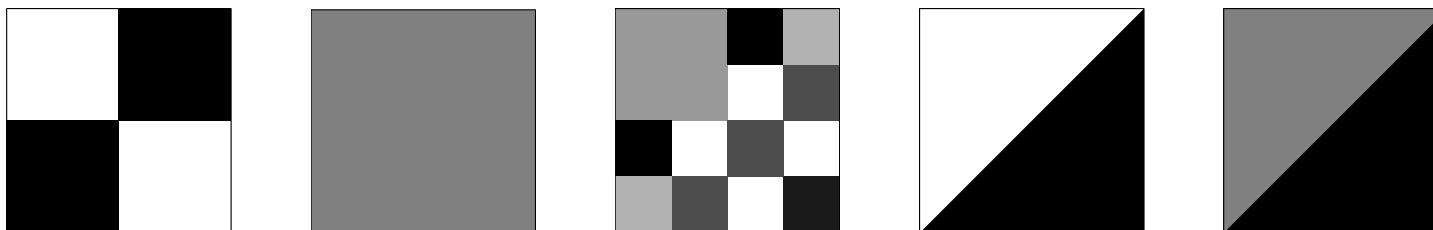
# QUASIRANDOM PERMUTATIONS

- When does a permutation look random?
- $n$ -point permutation: ordering of numbers  $1, \dots, n$   
 pattern:  $4\underline{5}321\underline{6} \rightarrow 213 \quad 4\underline{5}32\underline{1}6 \rightarrow 321$
- Question (Graham): The same finite phenomenon?  
 Theorem (K., Pikhurko, 2013): yes, 4-point patterns
- Theorem (Chan, K., Noel, Pehova, Sharifzadeh, Volec)  
 quasirandom  $\Leftrightarrow$  minimizer of pattern sum  
 classification of all such sets of 4-point permutations



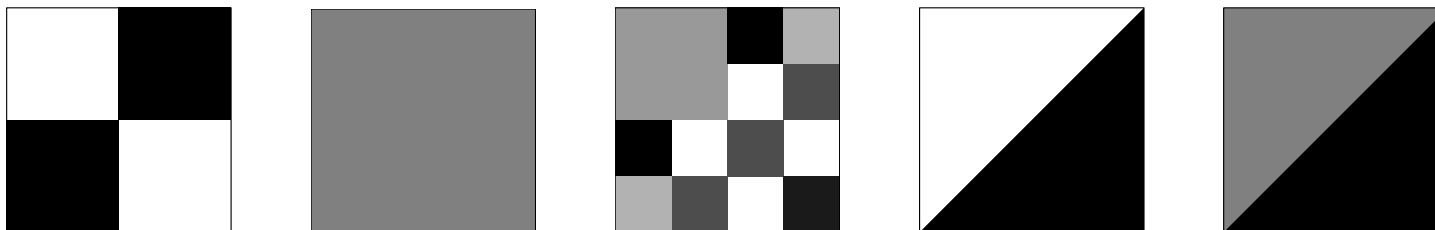
# FINITELY FORCIBLE GRAPHONS

- finitely forcible graphon  
determined by densities of **finitely** many graphs
- edge density =  $1/2$  and triangle density = 0  
quasirandom graphon, step graphons
- every finitely forcible graphon is a unique solution of  
an extremal graph theory problem



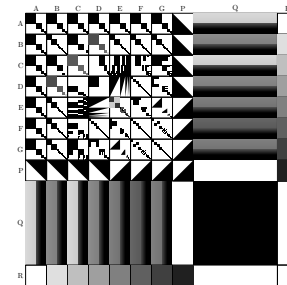
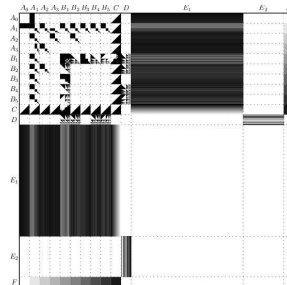
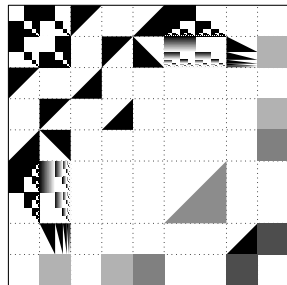
# EXTREMAL COMBINATORICS

- Conjecture (Lovász and Szegedy, 2011):  
Every extremal graph theory problem  
has a finitely forcible optimal solution.
- extremal graph theory problem  $\rightarrow$   
finitely forcible optimal solution  $\rightarrow$   
“simple structure” gives new bounds on old problems



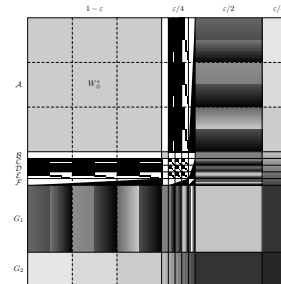
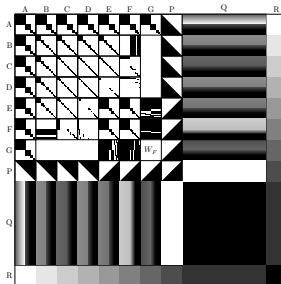
# COMPLEX FINITE GRAPHONS

- Conjectures (Lovász and Szegedy):  
The space  $T(W)$  of a finitely forcible  $W$  is compact.  
The space  $T(W)$  has finite dimension.
- disproved and stronger results in a series of papers coauthored by Cooper, Glebov, Kaiser, Klimošová, Noel and Volec



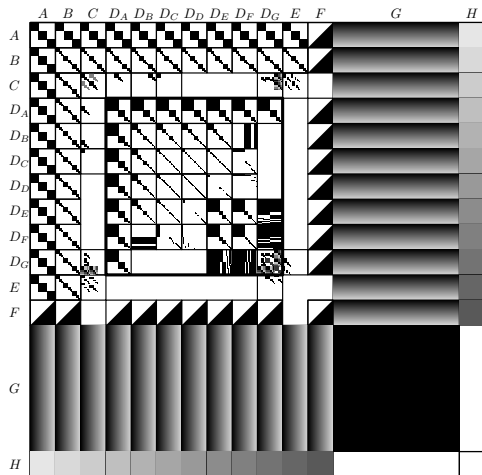
# UNIVERSAL CONSTRUCTIONS

- Theorem (Cooper, K., Martins)  
For every graphon  $W$ , there exists  
a finitely forcible graphon  $W_0$  such that  
 $W_0(x/13, y/13) = W(x, y)$  for every  $(x, y) \in [0, 1]^2$ .
- Theorem (K., Lovász Jr., Noel, Sosnovec)  
 $1/13$  can be replaced by  $1 - \varepsilon$ .



# NO FINITELY FORCIBLE OPTIMA

- Theorem (Grzesik, K., Lovász Jr.)  
There are extremal graph problems  
with no finitely forcible optimal solution.
- extensions to other parameters possible



- blackbox universal construction
- variable parts of graphon
- analysis of densities
- Implicit function theorem

# WHAT NEXT?

- bridge dense and sparse settings  
Backhausz and Szegedy 2018
- sampling in the sparse setting  
Aldous-Lyons conjecture, soficity of groups
- relation between approaches in the sparse setting

Thank you for your attention!