

# Characterizing homomorphism functions and the limit theory of graphs

LÁSZLÓ LOVÁSZ

Eötvös Loránd University, Budapest

## Three questions

**Mike Freedman:** *Which graph parameters are partition functions?*

**Jennifer Chayes:** *What is the limit of a randomly growing graph sequence like the internet?*

**Vera Sós:** *How to characterize generalized quasirandom graphs?*

# Homomorphism functions

Homomorphism: adjacency-preserving map

$\text{hom}(F, G) := \#$  of homomorphisms of  $F$  into  $G$

$$t(F, G) = \frac{\text{hom}(F, G)}{|V(G)|^{|V(F)|}}$$

Probability that random map  $V(F) \times V(G)$  is a hom

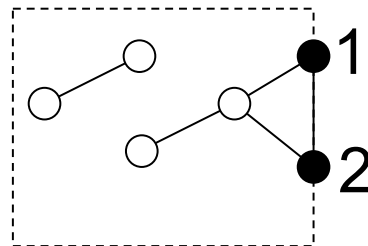
Weighted version:

$$H = (V, E, \alpha, \beta), \quad \alpha: V \rightarrow \mathbf{i}_+, \quad \beta: E \rightarrow \mathbf{i}$$

$$\text{hom}(G, H) := \sum_{\varphi: V(G) \rightarrow V(H)} \prod_{i \in V(G)} \alpha_{\varphi(i)} \prod_{ij \in E(G)} \beta_{\varphi(i)\varphi(j)}$$

# $k$ -labeled graphs

$k$ -labeled graph:  $k$  nodes labeled  $1, \dots, k$ ,  
any number of unlabeled nodes



$G_1, G_2$  :  $k$ -labeled graphs

$G_1 G_2 := G_1 \dot{\cup} G_2$ , labeled nodes identified

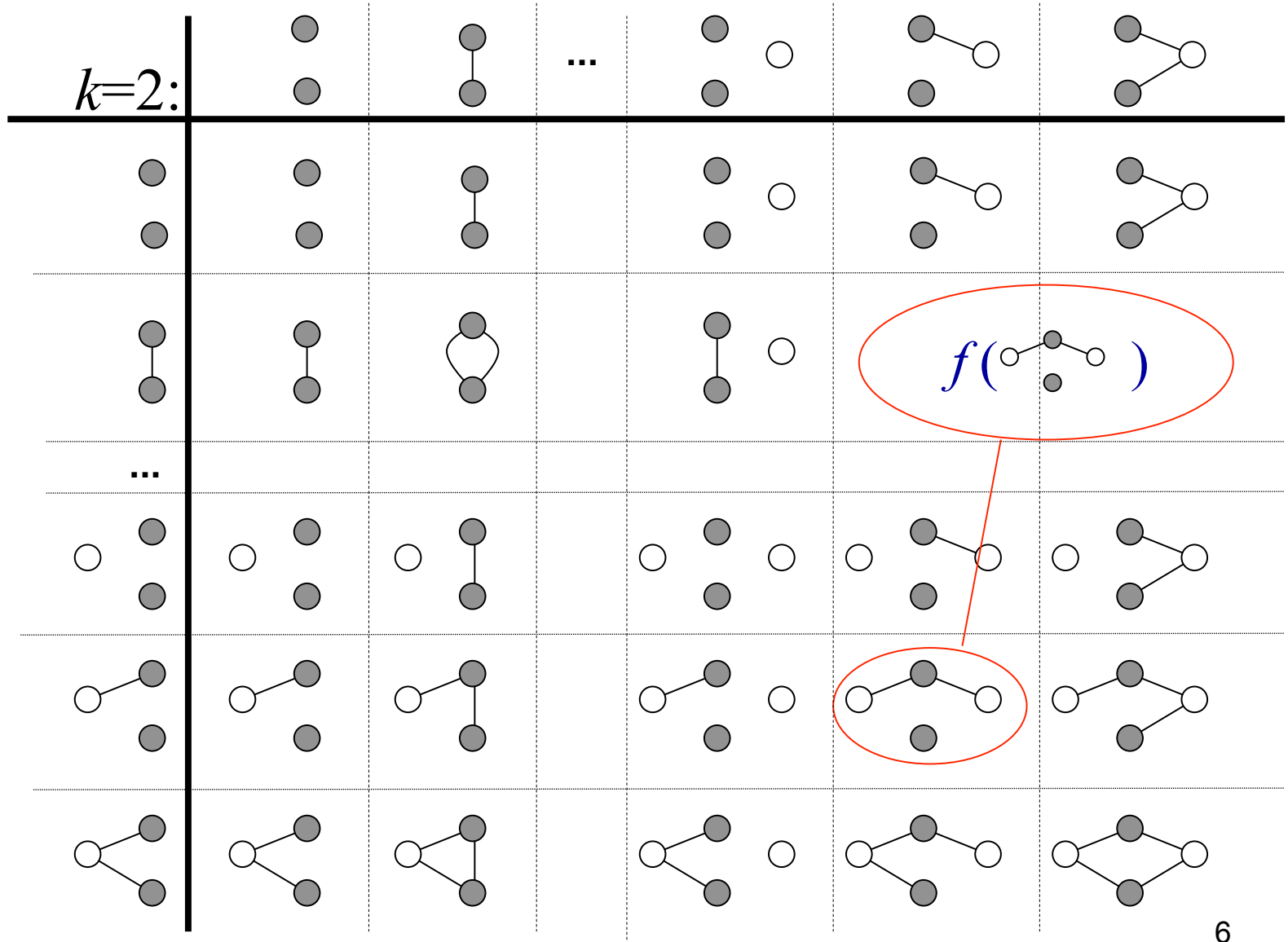
# Graph parameter

**Graph parameter:** isomorphism-invariant function  $f$   
on finite graphs

**Example:**  $\text{hom}(\cdot, H)$

# Connection matrices

$M(f, k)$



# Which parameters are homomorphism functions?

$f = \text{hom}(\cdot, H)$  for some weighted graph  $H$



$M(f, k)$  is positive semidefinite for all  $k$

and has rank  $\leq c^k$

Freedman - L - Schrijver

Difficult direction: ←

Easy but useful direction: ←

*many applications in  
extremal graph theory*

# Generalizations, analogues and relaxations

Generalizations: directed graphs (Schrijver),  
hypergraphs, semigroups (L-Schrijver)

Analogues: edge coloring models (Szegedy),  
unweighted graphs (L-Schrijver),  
tensor algebras (Schrijver),  
categories

Which graph parameters have connection matrices

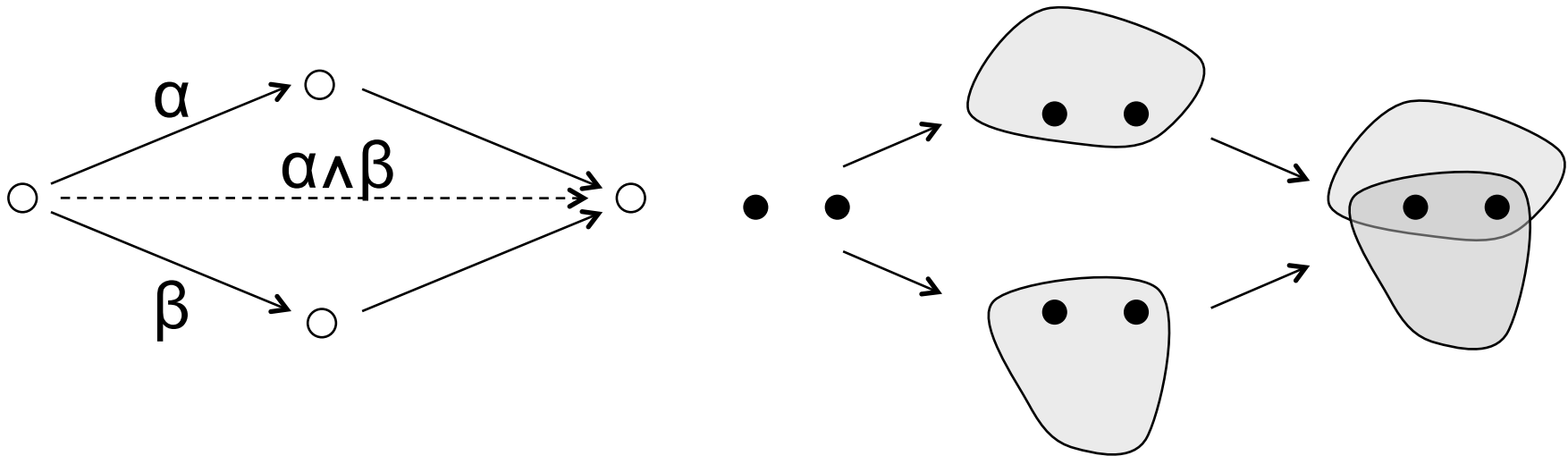
- positive semidefinite?
- finite rank?



# Locally finite categories

$\mathcal{K}$ : category,  $\mathcal{K}(a,b)$  finite for any two objects

(other conditions: zero object, generator object, pushouts, epi-mono decompositions)



# Locally finite categories

$f$ : objects  reals

$M(f, a)$ : matrix indexed by morphisms from object  $a$

$$M(f, a)_{\alpha\beta} = f(\alpha \wedge \beta)$$

$f = |\mathcal{K}(\cdot, b)|$  for some object  $b$



$M(f, a)$  is positive semidefinite for every object  $a$ .

L - Schrijver

## Corollary for simple graphs

$f = \text{hom}(\cdot, G)$  for some  $s \in \mathcal{G}$  (with loops)



hardcore  
model

$M^*(f, k)$  is positive semidefinite for every  $k$ .

L - Schrijver

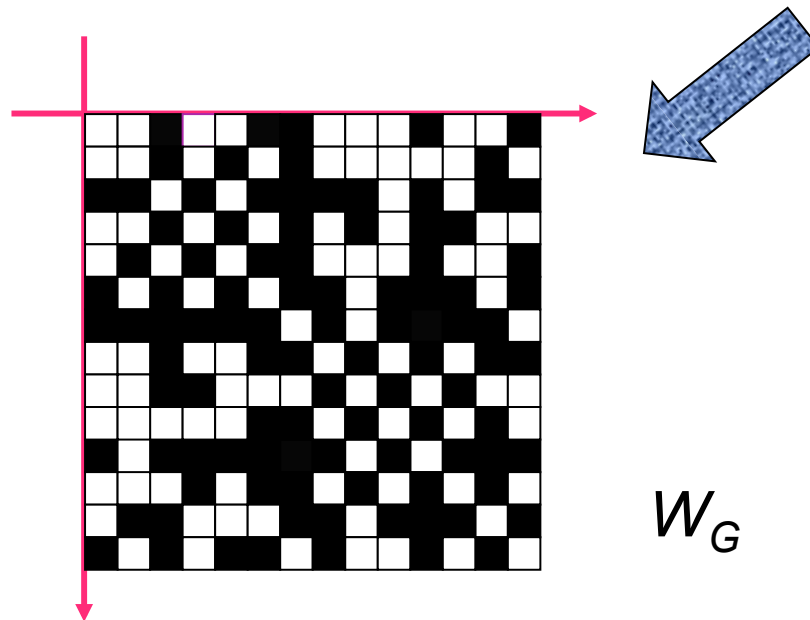
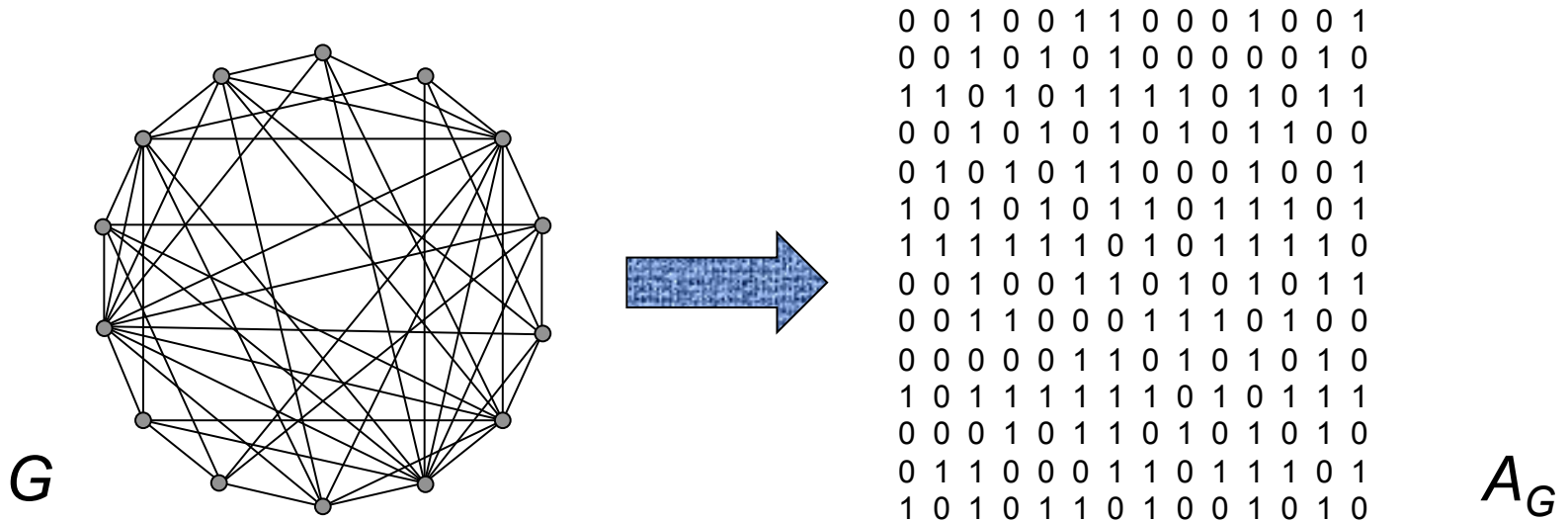
Allow a node to have more than one labels

# Convergence and limit objects

$$W_0 = \{W : [0,1]^2 \rightarrow [0,1] \text{ symmetric, measurable}\}$$

(graphons)

# Graphs Graphons



# Convergence and limit objects

$$W_0 = \{W : [0,1]^2 \rightarrow [0,1] \text{ symmetric, measurable}\}$$

(graphons)

$$t(F, W) = \int_{[0,1]^{V(F)}} \prod_{ij \in E(F)} W(x_i, x_j) dx$$

$$t(F, W_G) = t(F, G)$$

# Convergence and limit objects

$(G_1, G_2, \dots)$  convergent:  $\int F t(F, G_n)$  is convergent

Borgs, Chayes, L, Sós, Vesztegombi

$G_n \rightarrow W$ :  $\int F t(F, G_n) \rightarrow \int F t(F, W)$

This is for dense graphs



mean field theory

# Convergence and limit objects

For every convergent graph sequence  $(G_n)$  there is a graphon  $W$  such that  $G_n \xrightarrow{W} W$ .

L-Szegedy

For every graphon  $W$  there is a graph sequence  $(G_n)$  such that  $G_n \xrightarrow{W} W$ .

L-Szegedy

$W$  is essentially unique (up to measure-preserving transformation).

Borgs-Chayes-Lovasz



# Semidefinite connection matrices

$f$ : graph parameter

$f = t(\cdot, W)$  for some graphon  $W$



$M(f, k)$  is positive semidefinite for all  $k$ ,  $f(\text{square logo}) = 1$ , and  $f$  is multiplicative over components.

L - Szegedy

# Finite rank connection matrices

If  $M(f,k)$  has finite rank, then  $f(G)$  can be evaluated in polynomial time for graphs with tree-width at most  $k$ .

L- Welsh

# Finite rank connection matrices

$M(f,k)$  has finite rank for many parameters:  
hom( $\cdot$ ,H), hom(F, $\cdot$ ), # of Hamilton cycles,  
max no. of independent nodes,  $1_{\text{planar}}$ ,  
 $1_P$  for any minor-closed property P.

If  $f$  can be defined by a monadic second order counting problem, then  $M(f,k)$  has finite rank.

Godlin-Kotek-Makowski

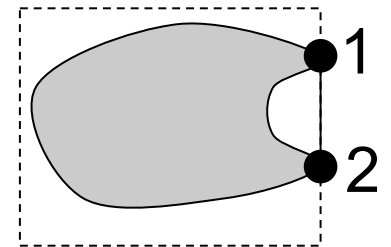
**Happy Birthday Mike!**

# Computing with graphs

$k$ -labeled quantum graph:

$$x = \mathring{\mathbf{a}}_G x_G G$$

finite formal sum of  
 $k$ -labeled graphs



$Q_k = \{k\text{-labeled quantum graphs}\}$

infinite dimensional linear space

# Computing with graphs

$$\begin{array}{c} \text{æ} \\ \text{f} \\ \text{e} \end{array} x_G G \begin{array}{c} \text{ö} \\ \text{f} \\ \text{ø} \end{array} y_G G \begin{array}{c} \text{ö} \\ \text{f} \\ \text{ø} \end{array} = \begin{array}{c} \text{å} \\ \text{f} \\ \text{ø} \end{array} x_{G_1} y_{G_2} G_1 G_2$$

$Q_k$  is a commutative algebra with unit element ...

Inner product:  $\langle x, y \rangle = f(xy)$

# Computing with graphs

$$N_k(f) = \{x \in Q_k : \langle x, y \rangle = 0 \text{ for all } y \in Q_k\}$$

$Q_k/N_k(f)$  is a commutative algebra

$Q_k/N_k(f)$  is finite dimensional iff  $M(f,k)$  has finite rank

$\langle \cdot, \cdot \rangle$  is semidefinite iff  $M(f,k)$  is positive semidefinite

# Computing with graphs

$p_1, \dots, p_q$ : idempotent basis in  $Q_k$  nodes (states)

$$\mathbb{W} = p_1 + \dots + p_n$$

$$\langle \mathbb{W}, p_i \rangle \quad \text{nodeweights}$$

$$\langle \mathbb{W} - \mathbb{W}, p_i p_j \rangle \quad \text{edgeweights}$$

if no symmetries