

# Hyperfinite graphs and combinatorial optimization

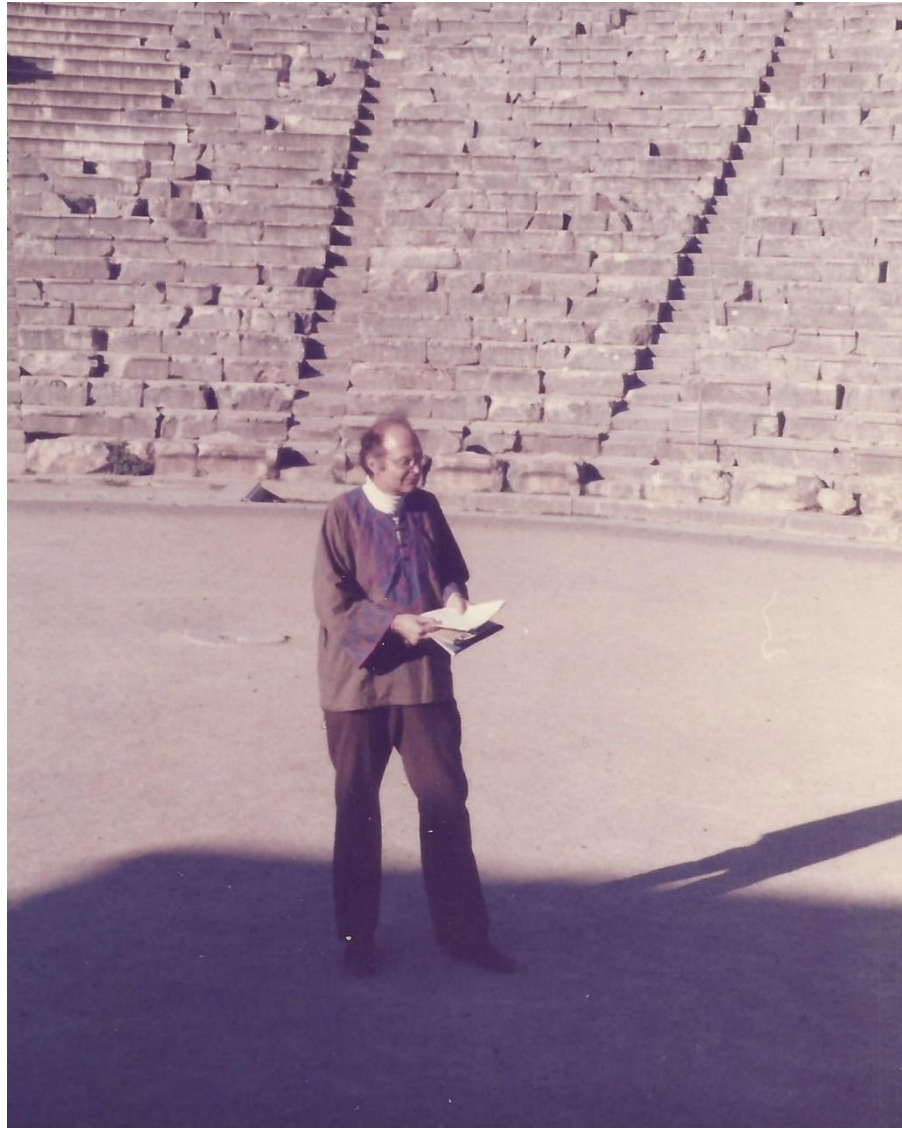
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and

Eötvös Loránd University, Budapest

# Don in Epidaurus 1995



January 2018

# Graphing, definition

Bounded degree ( $\leq D$ ) Borel graph  
on standard probability space  $V$  (say  $[0,1]$ )  
with “double counting” condition:

$$\int_A \deg(x, B) dx = \int_B \deg(x, A) dx = \eta(A \times B)$$

Extends to measure  $\eta$  on Borel subsets of  $V^2$ .

„edge measure”

# Why graphings?

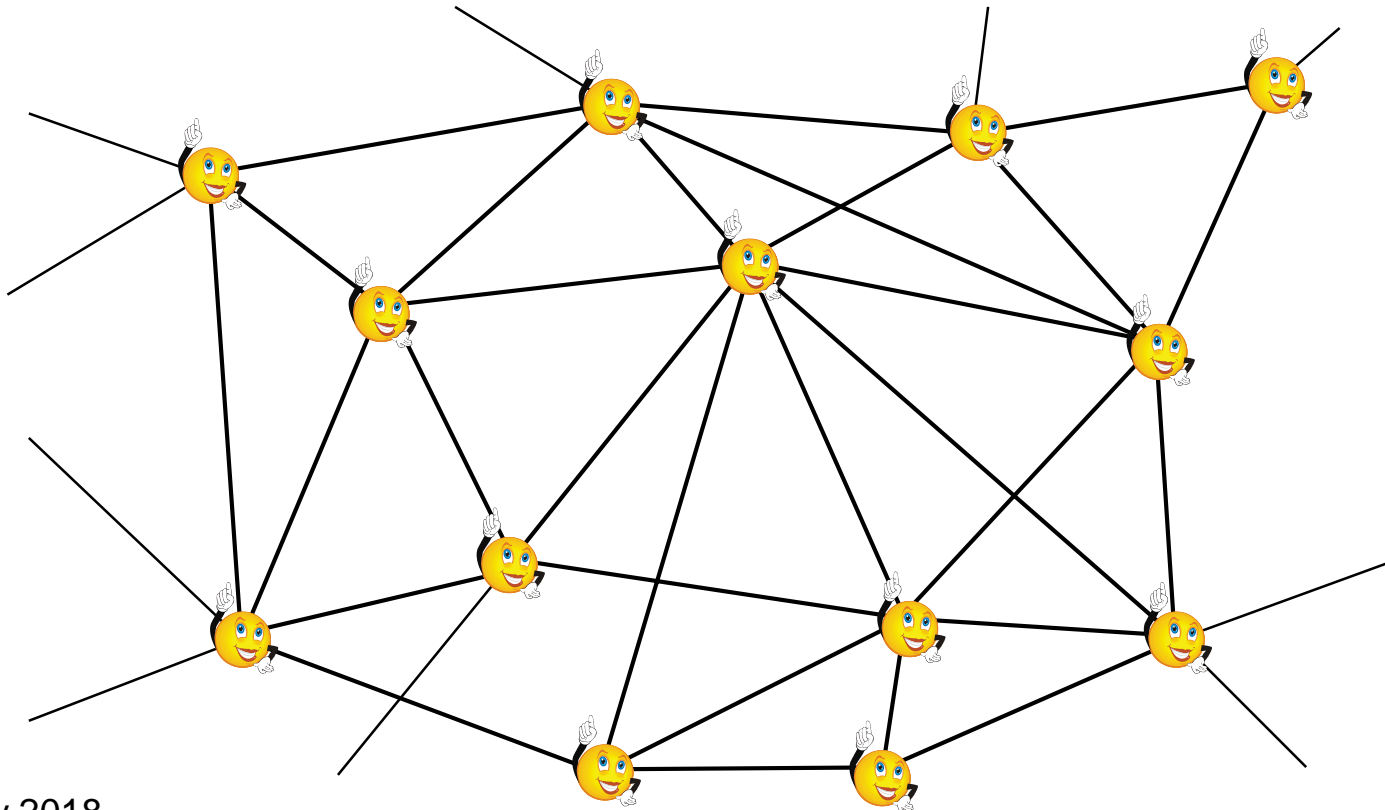
„The notion of an algorithm is basic to all of computer programming, so we should begin with a careful analysis of this concept.”

Donald Knuth

# Why graphings?

*Find a perfect matching in  $G$ .*

distributed algorithm: **Nguyen and Onak**

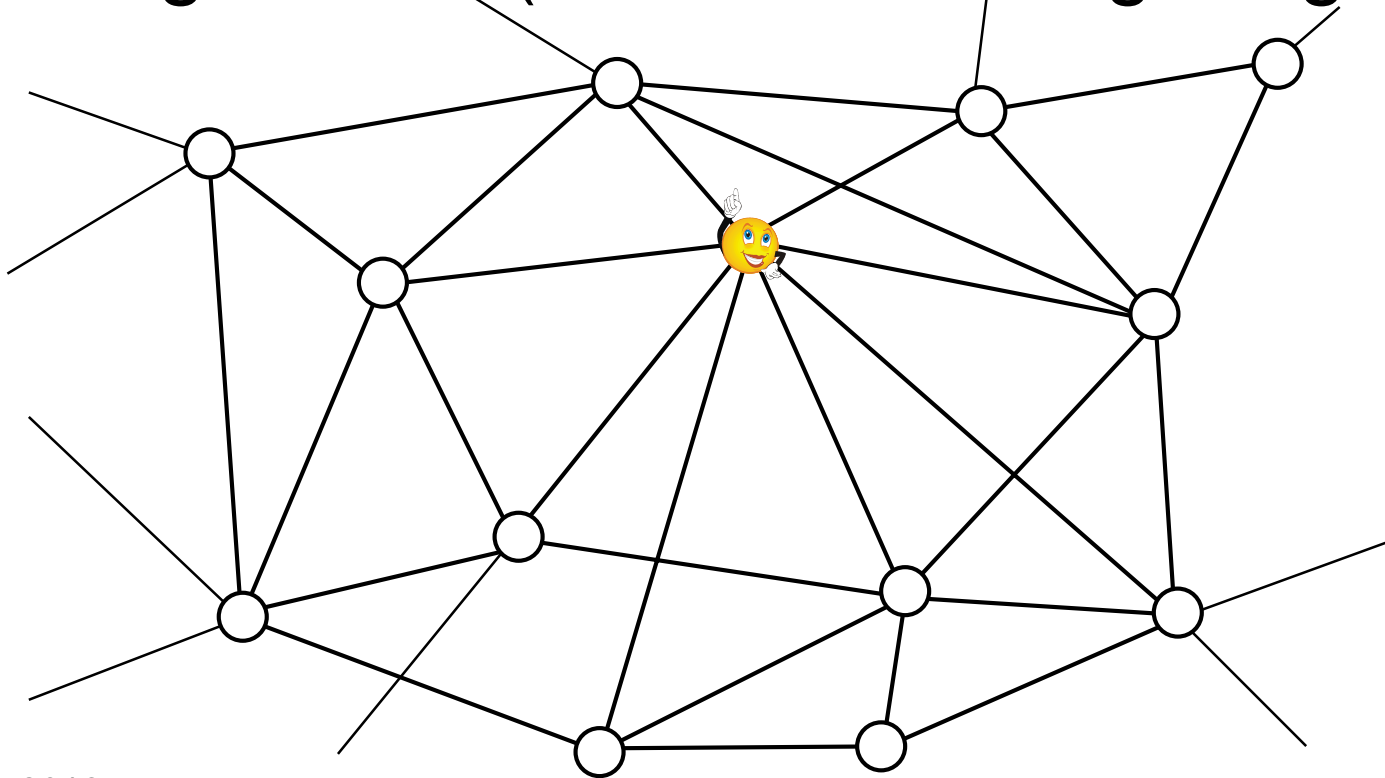


# Why graphings?

distributed algorithms



local algorithms (on bounded degree graphs)



# Why graphings?

distributed algorithms



local algorithms (on bounded degree graphs)



property testing (on bounded degree graphs)

# Why graphings?

distributed algorithms



local algorithms (on bounded degree graphs)



property testing (on bounded degree graphs)



local algorithms on graphings

The infinite is a good approximation  
of the large finite.



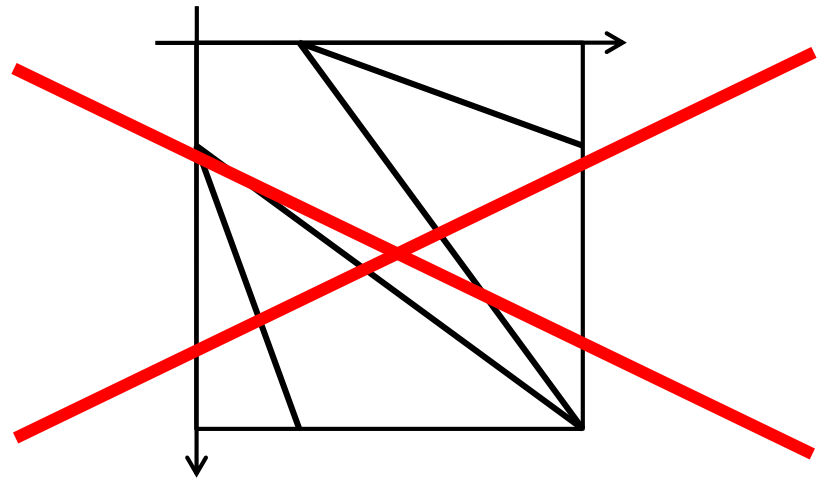
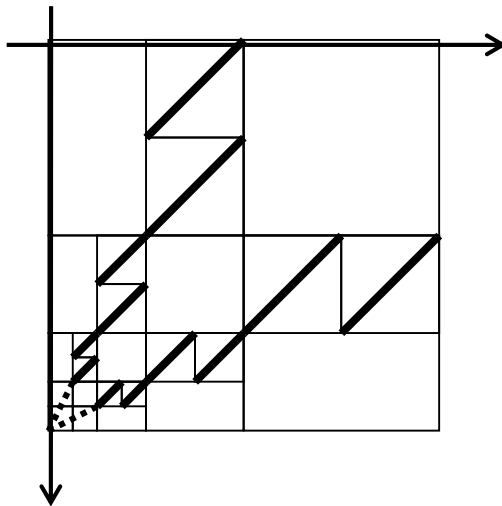
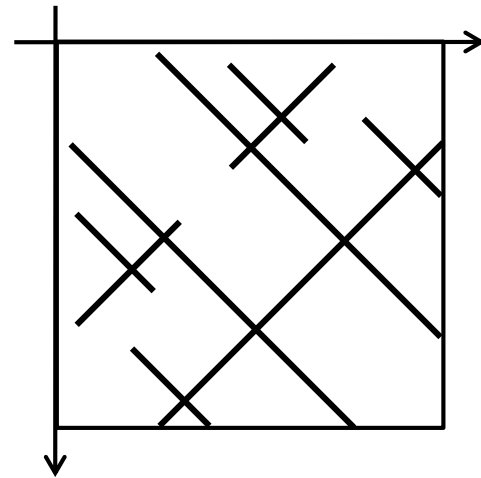
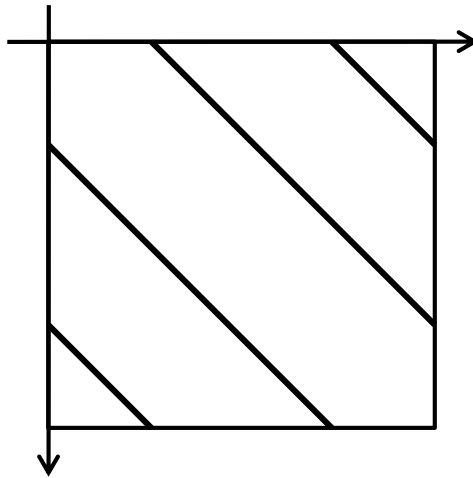
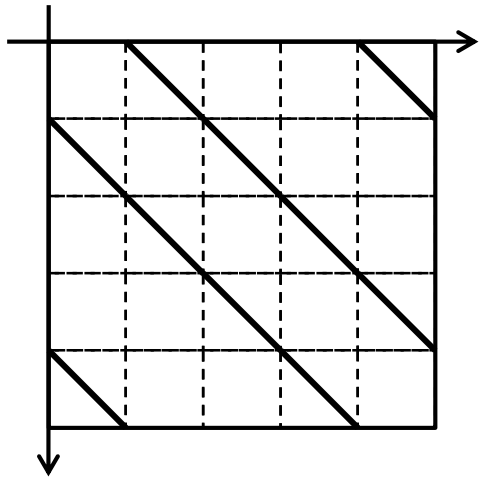
# Why graphings?

Ergodic theory

Finitely generated groups

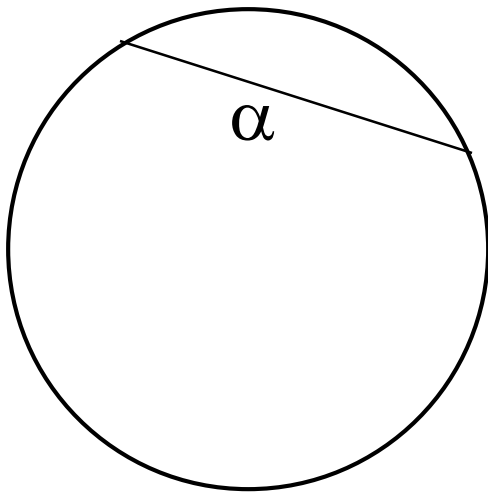
Limits of convergent graphs sequences  
with bounded degree

# Graphing, examples



# Graphing, examples

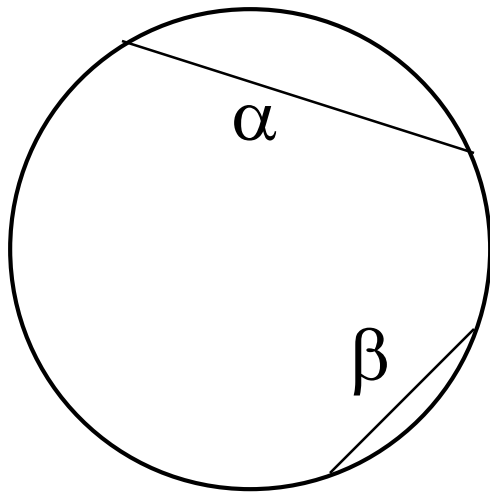
unit circumference  
 $\alpha$  irrational



components:  
2-way infinite paths

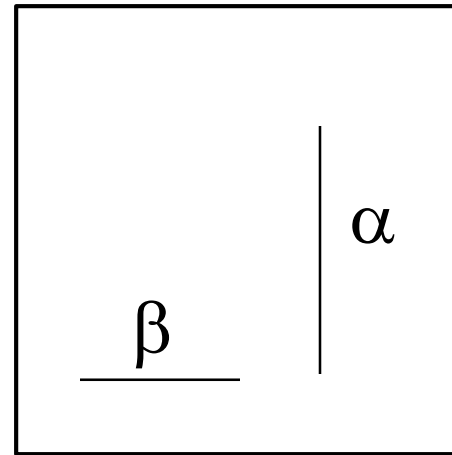
# Graphing, examples

unit circumference  
 $\alpha, \beta$  irrational, lin. indep



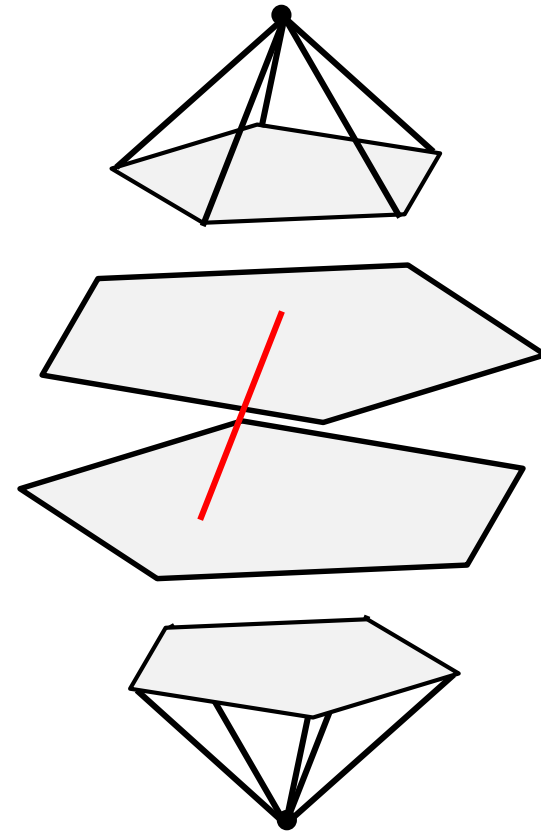
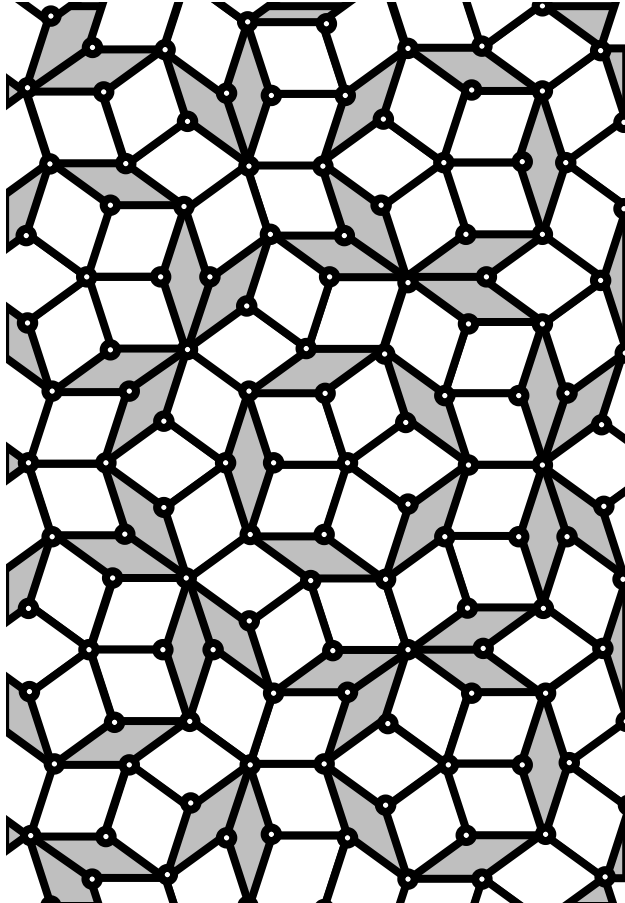
components: grids

1x1 torus  
 $\alpha, \beta$  irrational



components: grids

# Penrose tilings



rhombic icosahedron

de Bruijn - Bárász

# Local equivalence, definition

$x \in V \mapsto G_x$ : component of  $x$

uniform random  $x \mapsto G_x$ : random connected  
rooted (countable)  
graph

unimodular random  
network

Benjamini - Schramm

# Local equivalence, definition

$x \in V \mapsto G_x$ : component of  $x$

$G_1, G_2$  locally equivalent:

for random uniform  $x \in V$ ,

distributions of  $(G_1)_x$  and  $(G_2)_x$

are the same

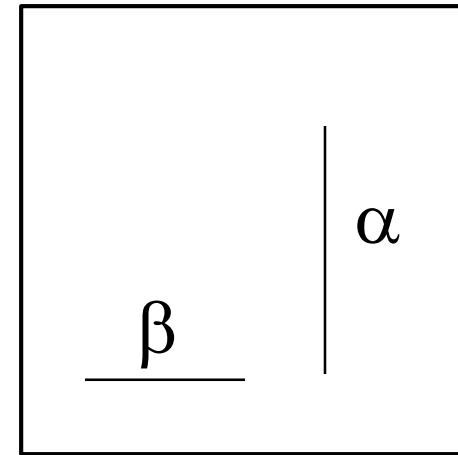
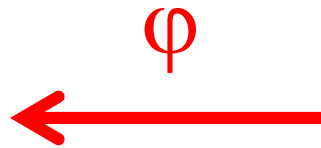
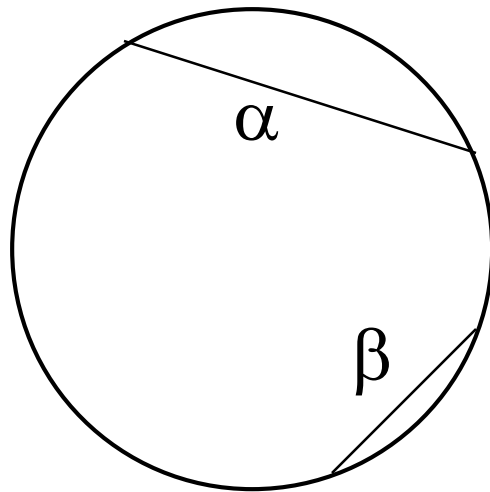
# Local isomorphism, definition

$\varphi : V(G_1) \rightarrow V(G_2)$  local isomorphism:  
measure preserving and  
 $(\forall x)$  isomorphism between  
 $(G_1)_x$  and  $(G_2)_{\varphi(x)}$

Existence of local isomorphism  
proves local equivalence.



# Local isomorphism, example



components: grids

components: grids

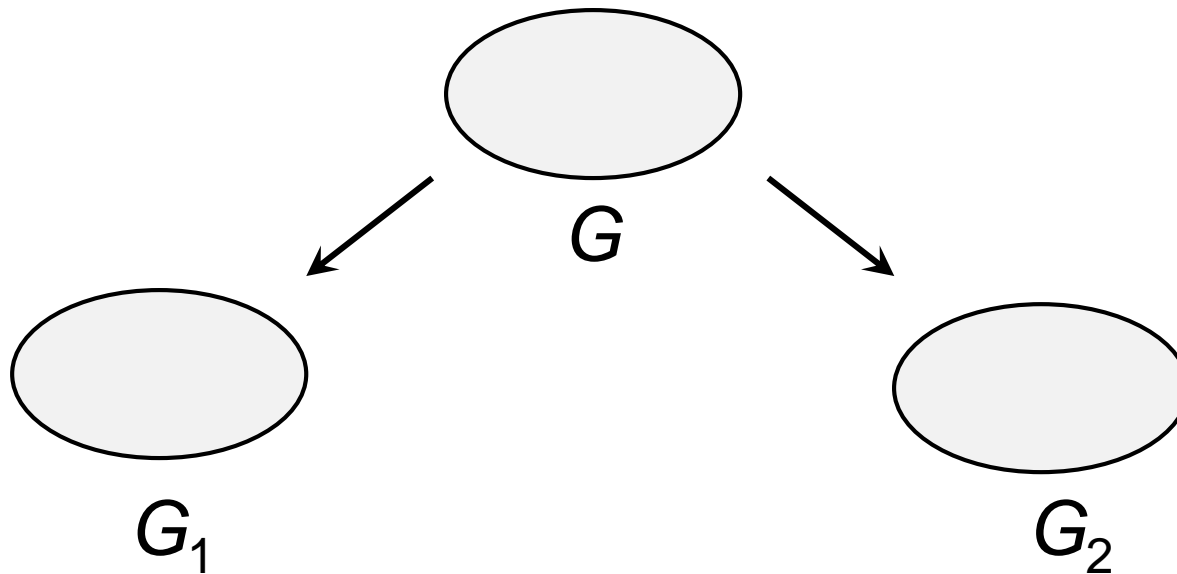
$$(x,y) \mapsto x+y \bmod 1$$

# Local equivalence

$G_1$  and  $G_2$  are locally equivalent



$\exists G$  and local isomorphisms  $G \rightarrow G_1, G \rightarrow G_2$ .



# Graph partition problem

**k-edge-separator:**  $T \subseteq E(G)$ ,  $\forall$  component of  $G-T$   
has  $\leq k$  nodes

Finite graph:

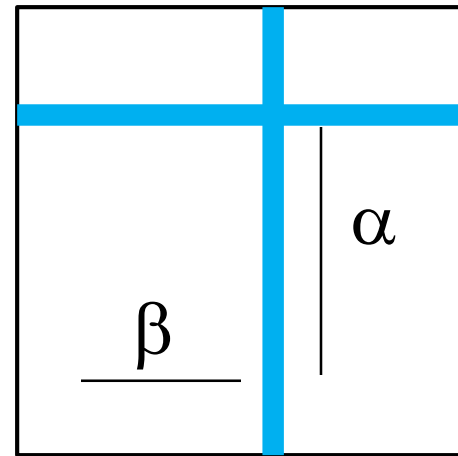
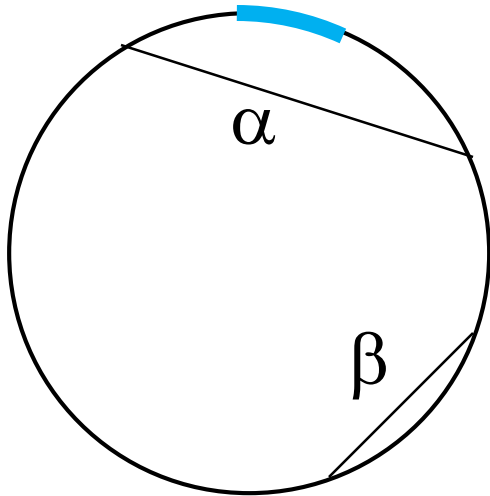
$$\text{sep}_k(G) = \min \left\{ \frac{|T|}{n} : T \text{ k-edge-separator} \right\}$$

Graphing:

$$\text{sep}_k(G) = \min \{ \eta(T) : T \text{ k-edge-separator} \}$$

**Graphing  $G$  hyperfinite:**  $\text{sep}_k(G) \rightarrow 0 \quad (k \rightarrow \infty)$

# Hyperfinite graphings, examples



Diophantine approximation

# Hyperfiniteness graph families

Family  $\mathcal{G}$  of finite graphs is hyperfinite:

$$\forall \varepsilon > 0 \exists k = k(\varepsilon) \forall G \in \mathcal{G} \text{ sep}_k(G) \leq \varepsilon.$$

**Hyperfiniteness:** paths, trees, planar graphs,  
every non-trivial minor-closed property

**Non-hyperfinite:** expanders

Every graph property is testable in any family of hyperfinite graphs.

Newman – Sohler  
(Benjamini-Schramm-Shapira,  
Elek)

Every graph property is testable in any family of hyperfinite graphs.

Many graph properties are polynomial time testable for graphs with bounded tree-width.

If  $G_n \rightarrow G$  locally, then  
 $\{G_n\}$  is hyperfinite  $\Leftrightarrow G$  is hyperfinite

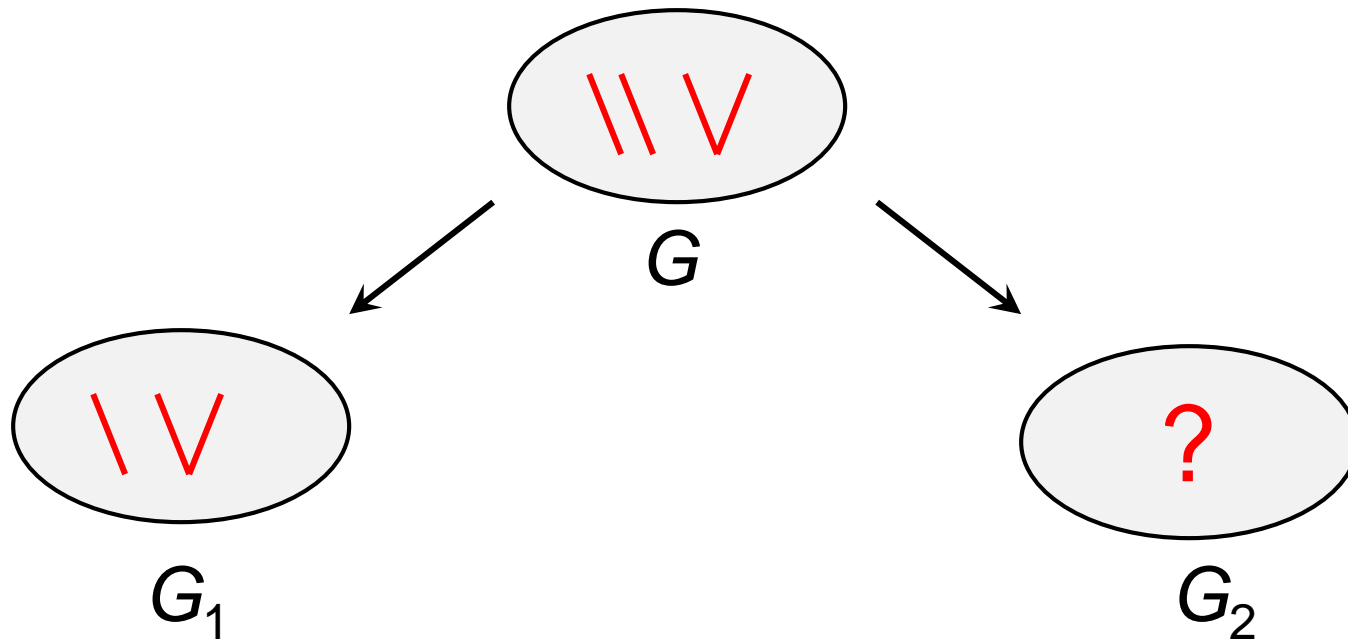
Schramm

(Benjamini-Shapira-Schramm)

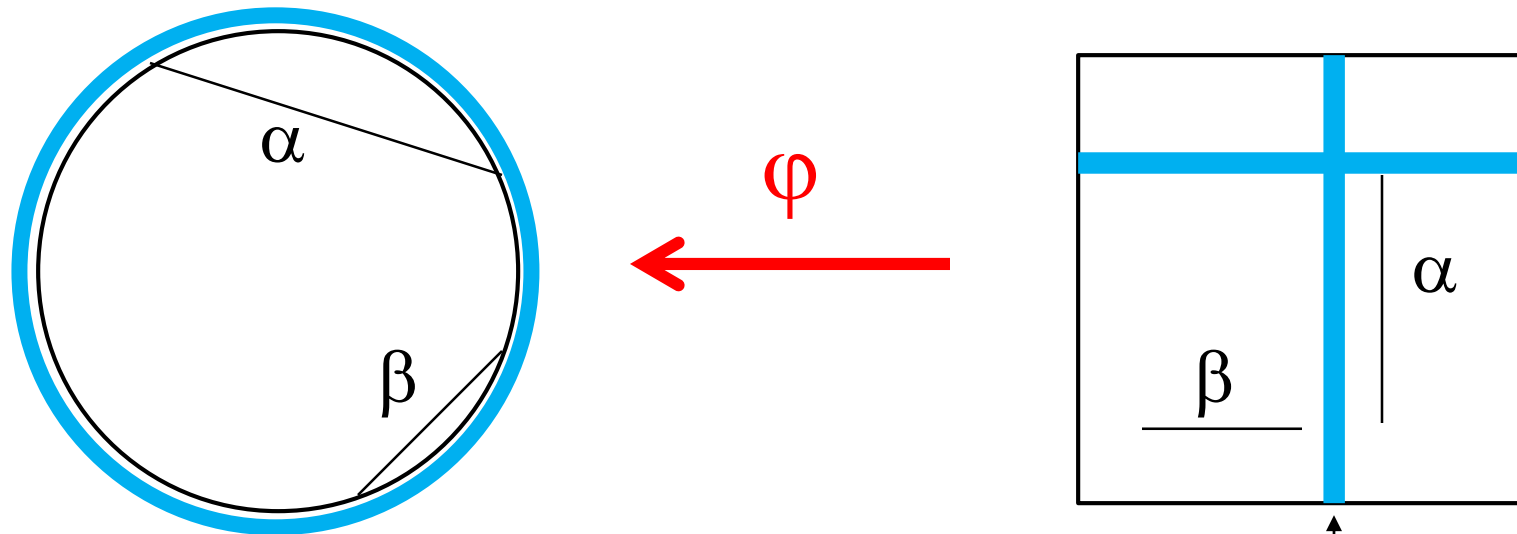


# Hyperfinite graphings

If  $G_1$  and  $G_2$  are locally equivalent, then  
 $G_1$  is hyperfinite  $\Leftrightarrow G_2$  is hyperfinite



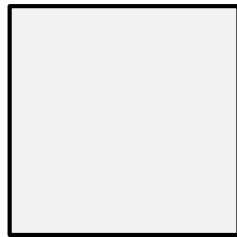
# Local isomorphism forward



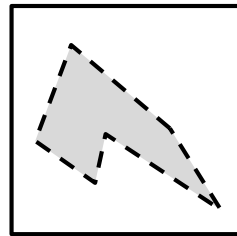
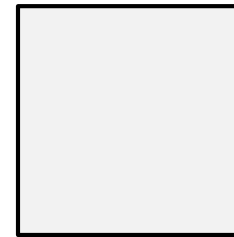
$$(x, y) \mapsto x + y \pmod{1}$$

Diophantine approximation

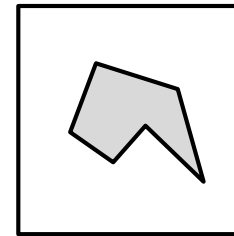
# Pushing forward and pulling back



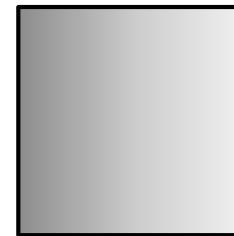
→  
measure  
preserving



←  
subset



→  
measure



linear  
relaxation



# Fractional graph partition problem

$$\mathcal{R}_k = \{ X \subseteq V(G) : G[X] \text{ connected, } |X| \leq k \}$$

$T$ : optimal  $k$ -edge-separator

$$\mathcal{F} = \{ V(H) : H \text{ comp't of } G - T \} \subseteq \mathcal{R}_k$$

# Fractional graph partition problem

$$\sigma(Y) = \begin{cases} \frac{|Y|}{n}, & \text{if } Y \in \mathcal{F}, \\ 0, & \text{if } Y \in \mathcal{R}_k \setminus \mathcal{F} \end{cases}$$

$$\sum_{Y \in \mathcal{R}_k} \sigma(Y) = 1$$

← probability distribution

$$\sum_{Y \ni x} \frac{\sigma(Y)}{|Y|} = \frac{1}{n}$$

← „marginal” uniform

$$\sum_{Y \in \mathcal{R}_k} \sigma(Y) \frac{|\partial Y|}{|Y|} = 2 \text{sep}_k(G)$$

← expected expansion

# Fractional graph/graphing partition problem

Define

$$\text{sep}_k^*(G) = \min_{\tau} \frac{1}{2} \mathbb{E}_{\tau} \left( \frac{|\partial Y|}{|Y|} \right)$$

Can be defined for graphings

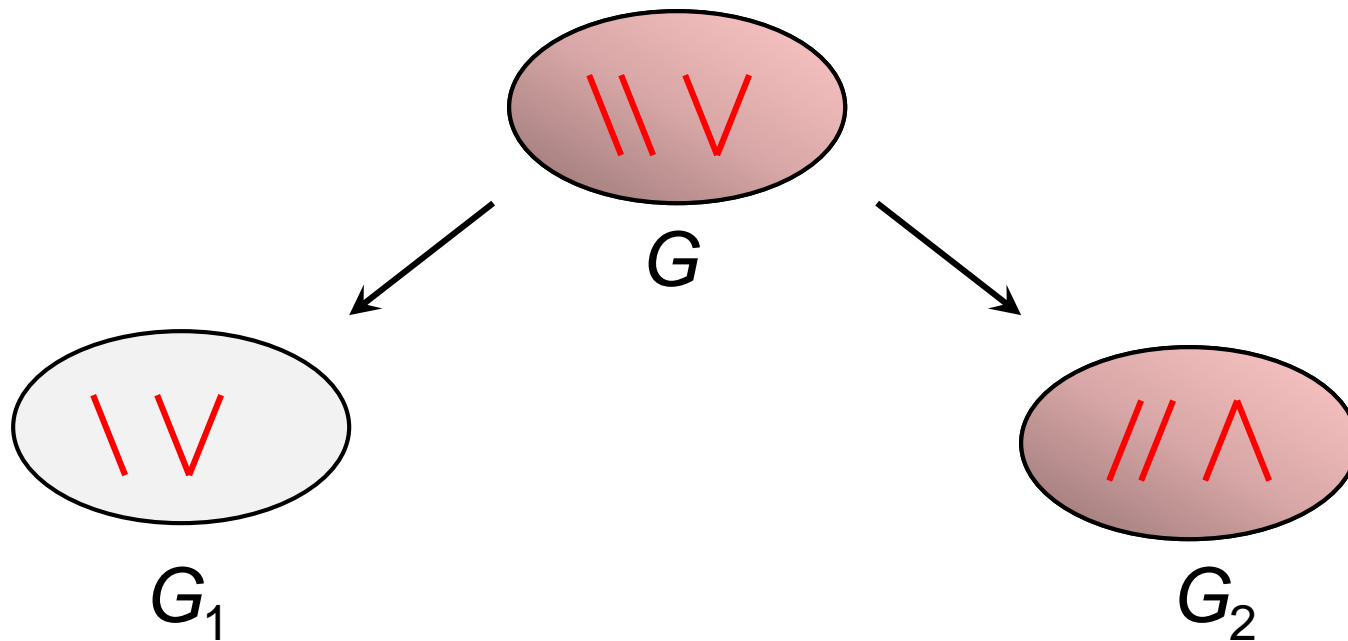
$\tau$  probability distribution on  $\mathcal{R}_k$   
with uniform marginal

$$\text{sep}_k^*(G) \leq \text{sep}_k(G) \leq \text{sep}_k^*(G) \log \frac{8D}{\text{sep}_k^*(G)}$$

no dependence on  $k$

# Hyperfinite graphings

If  $G_1$  and  $G_2$  are locally equivalent, then  
 $G_1$  is hyperfinite  $\Leftrightarrow G_2$  is hyperfinite



# Proof sketch

$$\text{sep}_k(G) \leq \text{sep}_k^*(G) \log \frac{8D}{\text{sep}_k^*(G)}$$

**Algorithm:** For  $j=1,2,\dots$ , select  $Y_1, Y_2, \dots \in \mathcal{R}_k$  so that  $Y_j$  is the minimizer of

$$\frac{|\partial Y|}{|Y \setminus (Y_1 \cup \dots \cup Y_{j-1})|}$$

**Output:**  $X = \partial Y_1 \cup \partial Y_2 \cup \dots$

On a graphing:  
no uncountable  
sequence of steps!  
Phases...



**Thanks, that's all!**