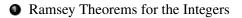
# QUASI-RANDOMNESS AND THE REGULARITY METHOD IN HYPERGRAPHS

VOJTĚCH RÖDL Emory University Atlanta, GA



Ramsey Theorems for the Integers



Graphs, Hypergraphs and its connection to Szemerédi's Theorem

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Über die Kongruenz  $x^m + y^m \equiv z^m \pmod{p}$ .

Von I. SCHUR in Berlin.

Im folgenden will ich zeigen, daß der Dicksonsche Satz sich fast unmittelbar aus einem sehr einfachen Hilfssatz ergibt, der mehr der Kombinatorik als der Zahlentheorie angehört:

Hilfseatz. Verteilt man die Zahlen 1, 2, ..., N irgendwie auf mZeilen, so müssen, sobald N > m!e wird, in mindestens einer Zeile zwei Zahlen vorkommen, deren Differenz in derselben Zeile enthalten ist.<sup>8</sup>)



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VON

BARTEL L. VAN DER WAERDEN (in Hamburg).

BAUDET hat vermutet dass für jedes l gilt: Behauptung 1 (l). Ist die unendliche Zahlenfolge 1, 2, 3, ...in zwei fremde Klassen eingeteilt, so liegt in einer dieser Klassen eine arithmetische Progression von l Zahlen.

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#### Conjecture of Baudet (and Schur)

If the natural numbers are split into two classes, then one class contains arithmetic progressions with any given number of terms.

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#### van der Waerden's Theorem

1927

For all integers  $m \ge 2$  and  $k \ge 3$  there exists an integer n such that any coloring of [n] with m colors yields a monochromatic arithmetic progression with k terms.

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# **A General Perspective**

# Question

Which linear equations have such a partition-property?

#### **Examples:**

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#### Rado's Theorem

Characterization of (systems of) linear equations with the partition-property.



#### Studien zur Kombinatorik.

Von

Richard Rado in Berlin.

#### Einleitung.

Diese Arbeit knüpft an einen in letzter Zeit viel genannten kombinatorischen Satz von van der Waerden<sup>1</sup>) an, welcher lautet:

1933

# **Partition Theorems:** Schur: $x + y = z \checkmark$ van der Waerden: $x + y = 2z \checkmark$

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Density version of Schur's theorem

- odd numbers contain no solution for Schur's equation
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- every  $A \subseteq [n]$  with  $|A| > \lceil n/2 \rceil$  contains a solution

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#### How about a density version of van der Waerden's theorem?

## Erdős-Turán Conjecture



#### ON SOME SEQUENCES OF INTEGERS

PAUL ERDÖS and PAUL TURÁN\*.

Consider a sequence of integers  $a_1 < a_2 < ... \leq N$  containing no three terms for which  $a_i - a_i = a_i - a_i$ , *i.e.* a sequence containing no three consecutive members of an arithmetic progression. Such sequences we call A sequences belonging to N, or simply A sequences. We consider those with the maximum number of elements, and denote by r = r(N)



#### Question (Erdős & Turán, 1936)

Set

$$r_k(n) = \max\{|A|: A \subseteq [n] \text{ containing no } k\text{-AP}\}.$$

Is it true that

$$\lim_{n\to\infty}\frac{r_k(n)}{n}=0$$
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Positive answer  $\implies$  van der Waerden's Theorem

## Lower Bound

# • Behrend (1946): $r_3(n) \ge \frac{n}{\exp(c\sqrt{\log n})}$ in particular

$$r_k(n) \ge r_3(n) \ge n^{1-o(1)}$$

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Szemerédi's Theorem

For every integer  $k \ge 3$  we have  $r_k(n) = o(n)$ .

1975

Different proofs of Szemerédi's Theorem have appeared:

- Combinatorics/Graph Theory (Szemerédi)
  - $\rightarrow$  used van der Waerden's theorem
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#### Remark

Other proofs appeared over the last decade:

• Elek and Szegedy using non-standard analysis

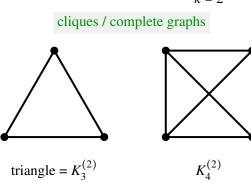
# II. Graphs and hypergraphs

# Definition

- V is a finite set, called the vertex set and
- *E* is a collection of *k*-element subsets of *V*, called the edge set.

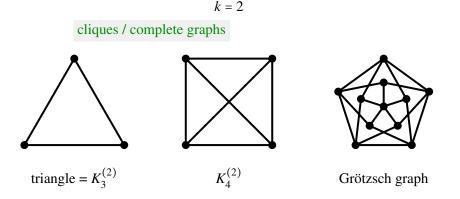
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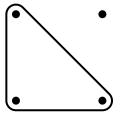
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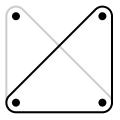
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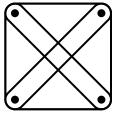


# **Graphs and Hypergraphs**

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A k-uniform hypergraph (k-graph)  $H^{(k)}$  on V is a pair (V, E), where

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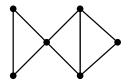
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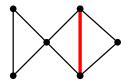
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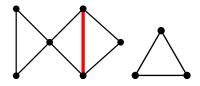
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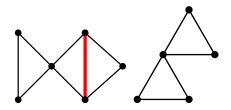
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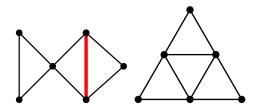
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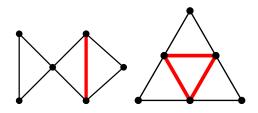
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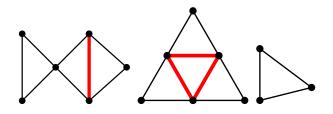
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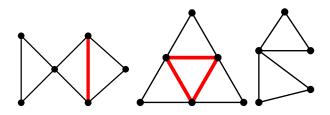
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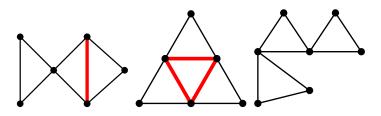
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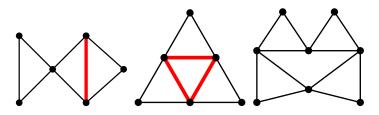
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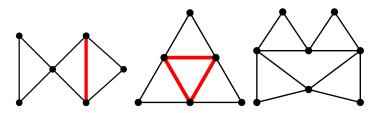


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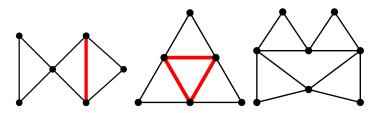


Question (Brown, Erdős & T. Sós, 1973)

How many edges can a simple triangle graph on *n* vertices have?

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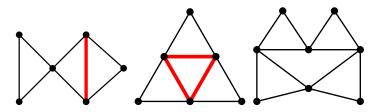


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Observation (Ruzsa & Szemerédi)

Theorem  $\implies$  Roth's Theorem  $(r_3(n) = o(n))$ 

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Jointly with Frankl we showed

- Affirmative answer  $\implies$  Szemerédi's Theorem
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This will follow, if we construct from *A* a 3-uniform hypergraph  $H^{(3)} = (V, E)$  satisfying:

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Consequently,

$$\Omega(n^2 \cdot |\mathbf{A}|) = |E| = o(n^3).$$

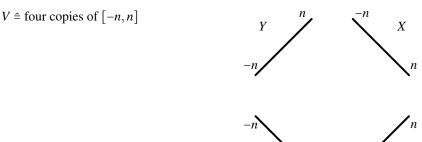
Which implies |A| = o(n).

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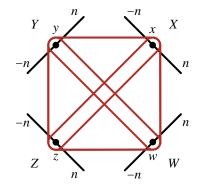
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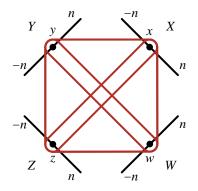
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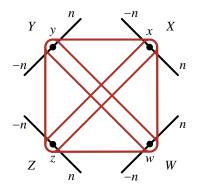
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#### and

$$3x + y - z - 3w = 2a$$

for some  $a \in A$ .



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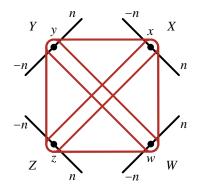
x + y + z + w = 0

#### and

$$3x + y - z - 3w = 2a$$

for some  $a \in A$ .

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$$|V| = O(n)$$
 and  $|E| = \Omega(n^2 \cdot |A|)$ 



Suppose  $A \subseteq [n]$  contains no 4-AP.

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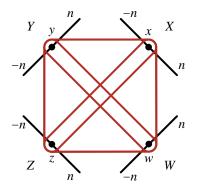
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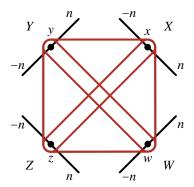
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**Fact:** Since *A* contains no 4-AP, every edge of  $H^{(3)}$  is in at most one clique.  $\Rightarrow H^{(3)}$  is a 3-uniform, simple clique hypergraph.



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Clique Union Lemma for 3-uniform hypergraphs  $\implies$   $r_4(n) = o(n)$ 

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Moreover:

Clique Union Lemma for hypergraphs

 $\implies$  Furstenberg-Katznelson theorem

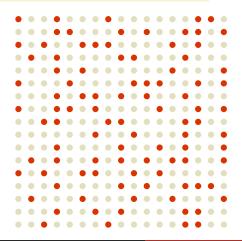
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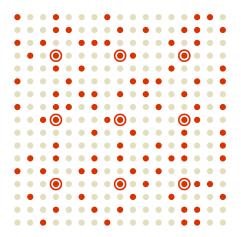
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# III. Regularity Method for Graphs

- Regularity Lemma
- Counting and Embedding Lemmas

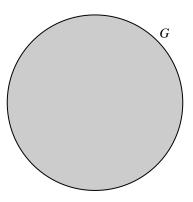
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- Regularity Lemma
- Counting and Embedding Lemmas
- Method is an important tool in graph theory

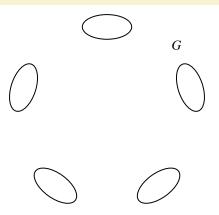
# III. Regularity Method for Graphs

- Regularity Lemma
- Counting and Embedding Lemmas
- Method is an important tool in graph theory
- Simple application yields Ruzsa-Szemerédi theorem (clique/triangle union lemma for graphs)

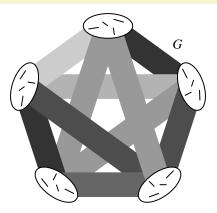
Every large graph G can be decomposed into "relatively few," mostly random-like (uniform edge distribution) bipartite subgraphs.



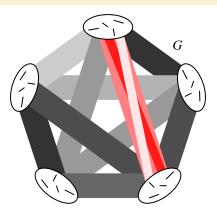
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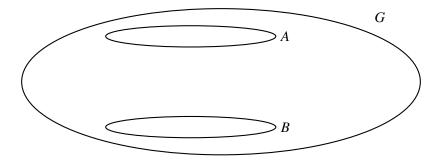
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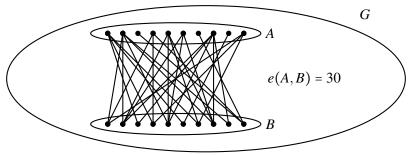


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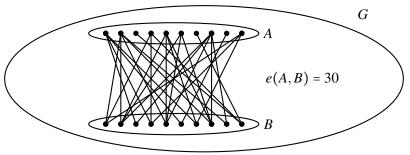
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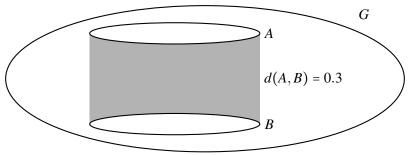


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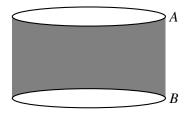


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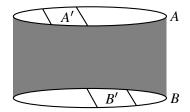
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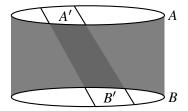
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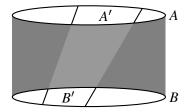
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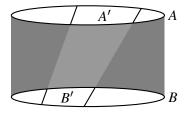


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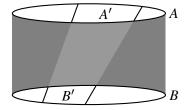
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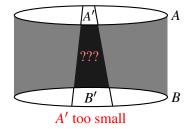
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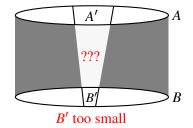
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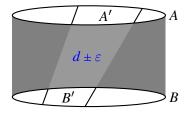
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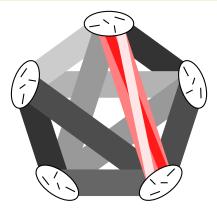
- sets threshold for |A'| and |B'|
- measures uniformity of edge distribution



## **Regular Partition**

#### Definition

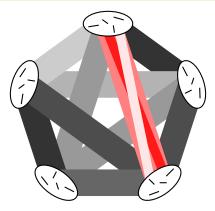
A partition  $V(G) = V_1 \cup \cdots \cup V_t$  is  $\varepsilon$ -regular if  $(V_i, V_j)$  are  $\varepsilon$ -regular for all but at most  $\varepsilon \begin{pmatrix} t \\ 2 \end{pmatrix}$  pairs *i*, *j* and  $||V_i| - |V_j|| \le 1$  for all pairs *i*, *j*.



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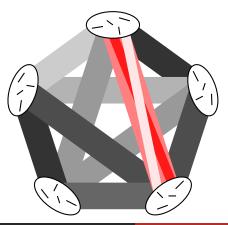
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Regularity Lemma: Every "large" graph admits an  $\varepsilon$ -regular partition.

#### Szemerédi's Regularity Lemma

 $\forall \varepsilon > 0 \ \exists T_0, N_0 \text{ s.t. every graph } G \text{ on } n \ge N_0 \text{ vertices admits an } \varepsilon$ -regular partition  $V(G) = V_1 \cup \cdots \cup V_t \text{ with } 1/\varepsilon \le t \le T_0.$ 

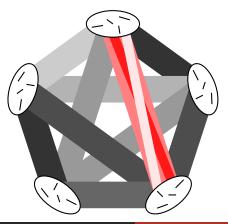


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• Edges in irregular pairs: at most  $\varepsilon n^2/2$ .

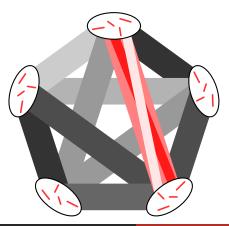


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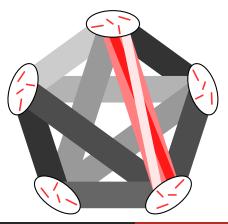
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Number of "uncontrolled edges" is at most  $\varepsilon n^2$ .



#### Triangle Counting Lemma

If *A*, *B*,  $C \subseteq V$  are disjoint vertex sets such that each pair is  $\varepsilon$ -regular with density  $\ge d$ , then the number of triangles is at least

$$(1 - o(1))d^3|A||B||C|$$

where  $o(1) \to 0$  as  $\varepsilon \to 0$ .



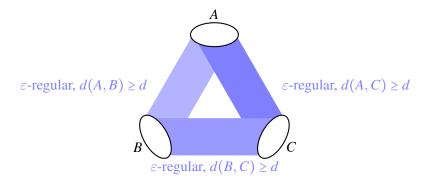


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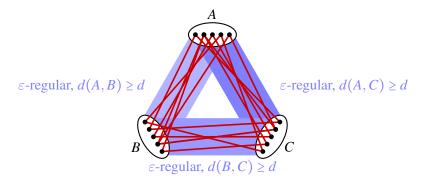


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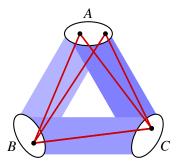


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In particular, there is some edge contained in at least two triangles.

Theorem (Ruzsa & Szemerédi)

 $\forall \delta > 0 \exists n_0 \text{ such that every simple triangle graph } G \text{ on } n \ge n_0 \text{ vertices}$ has less than  $\delta n^2$  edges.

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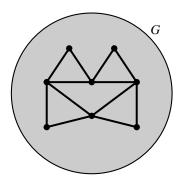
Proof:

- Combined application of Regularity Lemma and Counting Lemma with the following choice of constants
- Given  $\delta > 0$ , we choose d and  $\varepsilon$  such that

 $\varepsilon \ll d \ll \delta$ 

and let  $n_0$  be sufficiently large, so that the Regularity Lemma and the Counting Lemma can be applied.

• Let G = (V, E) be a simple triangle graph with  $|V| = n \ge n_0$  and  $|E| \ge \delta n^2$ .

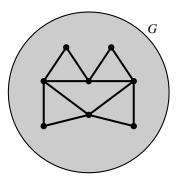


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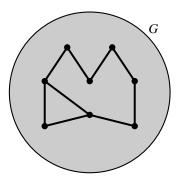


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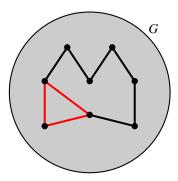


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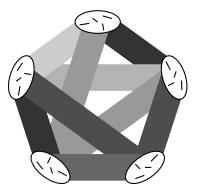
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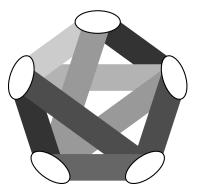
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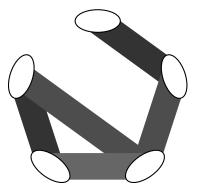
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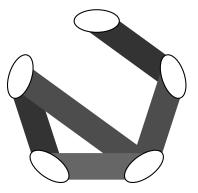
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- remove sparse pairs (density < *d*)



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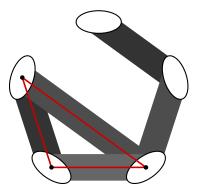
- if less than |E|/3 edges are removed, then a triangle must remain.
- apply Regularity Lemma with  $\varepsilon$
- remove "uncontrolled edges":
  - irregular pairs
  - within  $V_i$ 's
- remove sparse pairs (density < *d*)
- $\Rightarrow$  at most  $(\varepsilon + d)n^2 < \frac{\delta n^2}{3} \le \frac{|E|}{3}$  edges deleted



• Let G = (V, E) be a simple triangle graph with  $|V| = n \ge n_0$  and  $|E| \ge \delta n^2$ .

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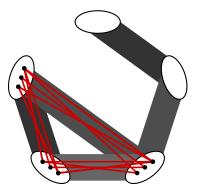
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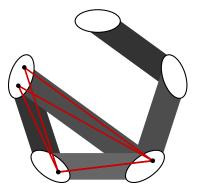
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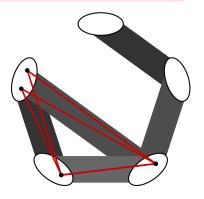
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Since *G* is a simple triangle graph:

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4

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- $\Rightarrow$  Counting Lemma applies
- $\Rightarrow G \text{ is not a simple triangle graph}$  $\Rightarrow |E| < \delta n^2$



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### Theorem (Removal Lemma)

For every  $\varepsilon > 0$  and every graph F with  $\ell$  vertices, there is some c > 0 and  $n_0$  such that any graph G on  $n \ge n_0$  vertices satisfies:

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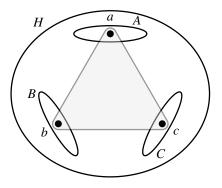
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### Removal Lemma (informal version)

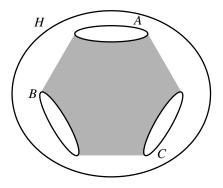
If G contains only "a few" copies of F, then one can remove "a few" edges from G to obtain an F-free graph.

# IV. Regularity Method for Hypergraphs



#### Number of edges:

$$e(A, B, C) = |\{\{a, b, c\} \in E(H): a \in A, b \in B, c \in C\}|$$

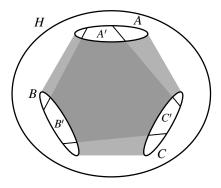


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**Density:** 

$$d(A,B,C) = \frac{e(A,B,C)}{|A||B||C|}$$



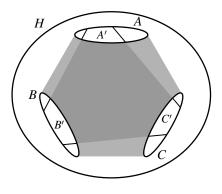
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# $\varepsilon$ -regularity: For all $A' \subset A, B' \subset B, C' \subset C$ with $|A'| \ge \varepsilon |A|, |B'| \ge \varepsilon |B|, \text{ and } |C'| \ge \varepsilon |C|$ $|d(A, B, C) - d(A', B', C')| < \varepsilon$



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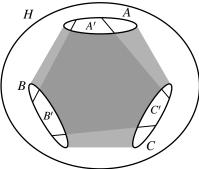
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Regularity Lemma: easy to prove

(simple extension of graph case)



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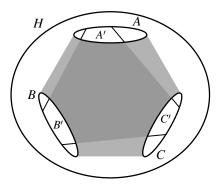
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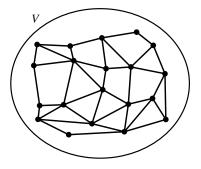
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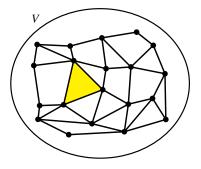
Regularity Lemma:easy to prove(simple extension of graph case)Counting Lemma:fails to be true(too weak a notion of regularity)

Counterexamples for the Counting Lemma suggest that hyperedge distribution must be uniform on pairs (and not only on vertices).

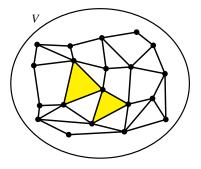


Setup:

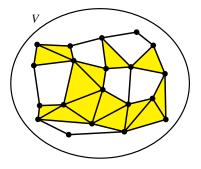
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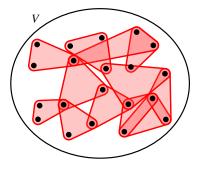
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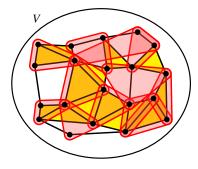
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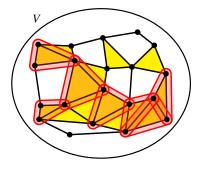
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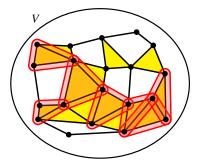
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**Density with respect to** G:

$$d(H \mid G) = \frac{|E_H \cap \mathcal{K}_3(G)|}{|\mathcal{K}_3(G)|}$$

where  $d(H \mid G) = 0$  if G is triangle-free.

# **Regularity of 3-Uniform Hypergraphs Respecting Pairs**



#### Setup:

- given graph  $G = (V, E_G)$
- $\mathcal{K}_3(G)$  = set of triangles in G
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**Density with respect to** G:

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Definition (*H* is  $\varepsilon$ -regular with respect to *G*)

For all subgraphs  $G' \subseteq G$  with  $|\mathcal{K}_3(G')| \ge \varepsilon |\mathcal{K}_3(G)|$  we have  $|d(H | G) - d(H | G')| < \varepsilon$ .

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- The partition classes of (k 1)-sets are uniformly distributed with respect to the partition classes of the (k 2)-sets.

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• The partition classes of (k - 1)-sets are uniformly distributed with respect to the partition classes of the (k - 2)-sets.

#### *H* is regular

Hyperedges of *H* are uniformly distributed with respect to the partition classes of the (k - 1)-sets.

# **Removal Lemma for hypergraphs**

• Regularity Method for hypergraphs yields:

Theorem (Clique Union Lemma)

Every k-uniform, simple clique hypergraph on n vertices has  $o(n^k)$  edges.

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For every  $\varepsilon > 0$  and every k-uniform hypergraph F with  $\ell$  vertices, there is some c > 0 and  $n_0$  such that any hypergraph H on  $n \ge n_0$  vertices satisfies:

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#### Question

Can *F* be replaced by a (possibly infinite) family  $\mathcal{F}$ , i.e., *either H is close to containing no*  $F \in \mathcal{F}$  or *H contains many copies of some*  $F \in \mathcal{F}$ ?

# V. Generalizations of the Removal Lemma

# **Problems and Results on Graphs and Hypergraphs: Similarities and Differences**

Paul Erdös

Many papers and also the excellent book of Bollobás, recently appeared on extremal problems on graphs. Two survey papers of Simonovits are in the press and Brown, Simonovits and I have several papers, some appeared, some in the press and some in preparation on this subject.

"3" Froblems and results on graphs and hypergraphs; "Similarities and differences, 20 C. Endb 8. Many paper, and also the exillent book of Bolloba's, recently appeared on extremal problems



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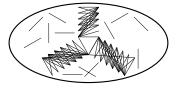
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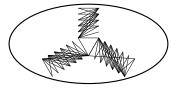
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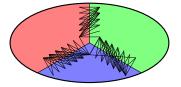
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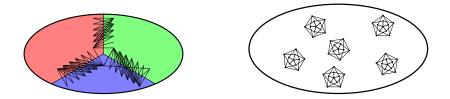
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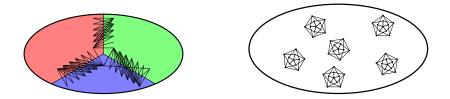
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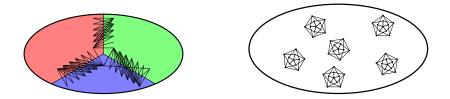
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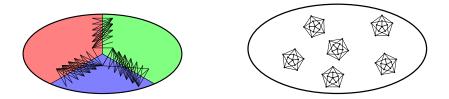
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- Bollobás, Erdős, Simonovits, and Szemerédi solved it for  $\mathcal{F}_3$  in 1978
- $\mathcal{F}_r$  for any  $r \ge 4$  was confirmed jointly with Duke in 1985

#### Theorem (Alon & Shapira, 2005)

Let  $\mathcal{F}$  be a possibly infinite family of graphs.  $\forall \varepsilon > 0 \exists c, L, n_0 \text{ s.t. every graph } G \text{ on } n \ge n_0 \text{ vertices satisfies:}$ 

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- hypergraph version was obtained jointly with Schacht (2007)
   → further refinement by Austin and Tao (2010)
- Application in Theoretical Computer Science in the area of Property Testing (introduced by Rubinfeld and Sudan in 1996 and Goldreich, Goldwasser, and Ron in 1998)

# **Open Problem**

 $\forall \delta > 0 \exists n_0$  such that any simple triangle graph *G* on  $n \ge n_0$  vertices satisfies  $e(G) \le \delta n^2$ .

 $RSz(\delta)$  = smallest  $n_0$  which satisfies the theorem for  $\delta$ 

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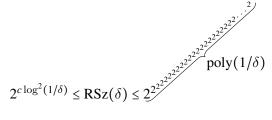
Known bounds: Behrend

$$2^{c\log^2(1/\delta)} \leq \mathrm{RSz}(\delta)$$

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Known bounds: Behrend, Ruzsa-Szemerédi (1978)



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Known bounds: Behrend, Fox (2011)

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Is it true that

#### Problem

Improve these bounds!

 $\forall \delta > 0 \ \exists n_0$  such that any simple triangle graph *G* on  $n \ge n_0$  vertices satisfies  $e(G) \le \delta n^2$ .

 $RSz(\delta)$  = smallest  $n_0$  which satisfies the theorem for  $\delta$ 

$$\operatorname{RSz}(\delta) \stackrel{???}{\leq} 2^{2^{2^{1/\delta}}}$$

where the height of the  $t^{o^{w^{e^{r}}}}$  is independent of  $\delta$ ?





# Thank you!