

Ramsey Theory and Big Data

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Joint Work with M.Waddell (Columbia University)

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- 2 Story 2: Goodman's Theorem
- 3 Story 3: How many bad colourings?

Calude and Longo, 2016: “The Deluge of Spurious Correlations in Big Data”

Hey, data scientists and statisticians, Ramsey Theory should say something about large data sets.

Beginning of the story

Calude and Longo, 2016: “The Deluge of Spurious Correlations in Big Data”

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M. Waddell (Columbia, PhD student in data science)

Hey, Mike, let's follow the lead of Calude-Longo.

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- The connections are largely unexplored.
- Impactful, applicable research.

Story 2: Goodman's Theorem



Toy Problem 1

You discover that on Tuesday, Honza wore 3 shirts. (You also know that he wore 11 shirts over the course of the 5-day conference.)

Should we conclude that something special happened to Honza on Tuesday?

Spurious Correlations

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A **spurious correlation** is one that is a result of forced, geometric or combinatorial relations.

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Fix a (“small”) m . There is a (“large”) n such that every blue/red edge colouring of K_n contains a monochromatic K_m .

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Theorem (folklore?)

Every red/blue edge colouring of a K_6 contains at least 2 monochromatic triangle.

Theorem (Goodman 1959)

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Every red/blue edge colouring of K_n must contain at least $\frac{1}{4} \frac{n-4}{n-1}$ fraction of monochromatic triangles.

Recall: $\binom{5}{3} = 10$, $\binom{6}{3} = 20$.

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Question 2

What is this measuring?

What about K_4 ?

Conjecture: Erdős

For large n , every red/blue edge coloured K_n , (asymptotically) at least $\frac{1}{32}$ many of the K_4 should be monochromatic.

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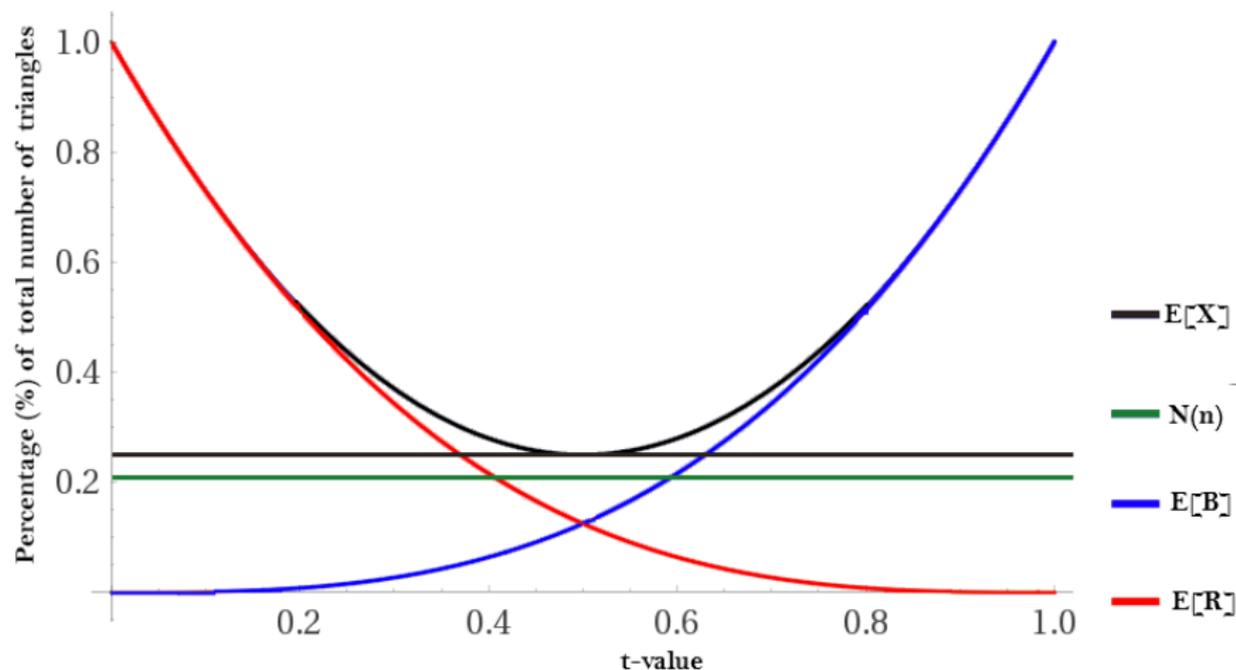
Thomason, 1989

There are red/blue edge colourings of (large) K_n with only $\frac{1}{33}$ many monochromatic triangles.

For K_m : there are colourings with $0.936 \cdot 2^{1-\binom{m}{2}}$ monochromatic K_m .

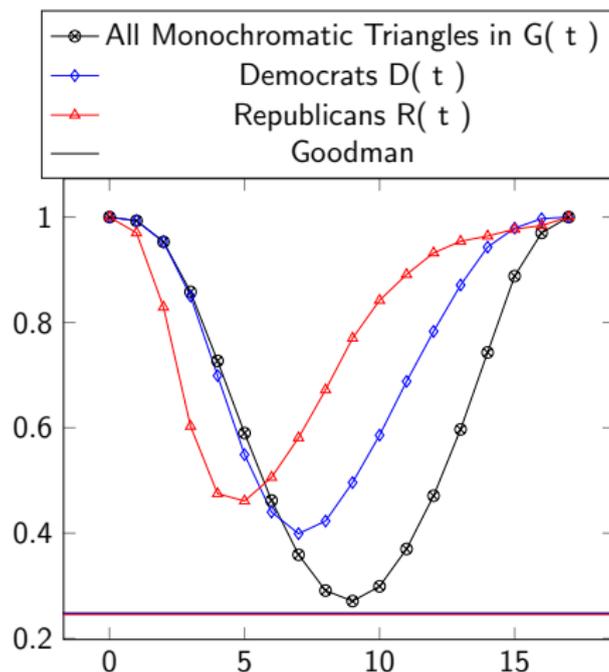
How can this be used?

This can be used to give a meaningful measure of randomness.



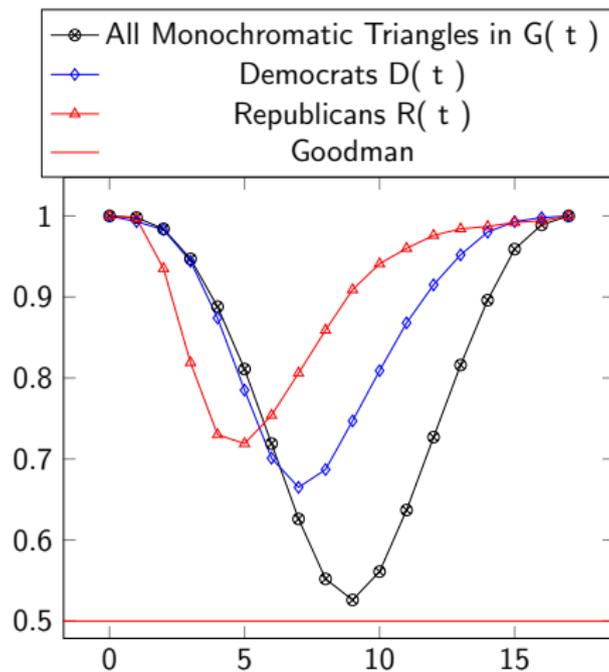
Real data set: 1984 US Congress voting

168 Republicans + 267 Democrats = 435 Voters. 16 votes, Hamming distance.



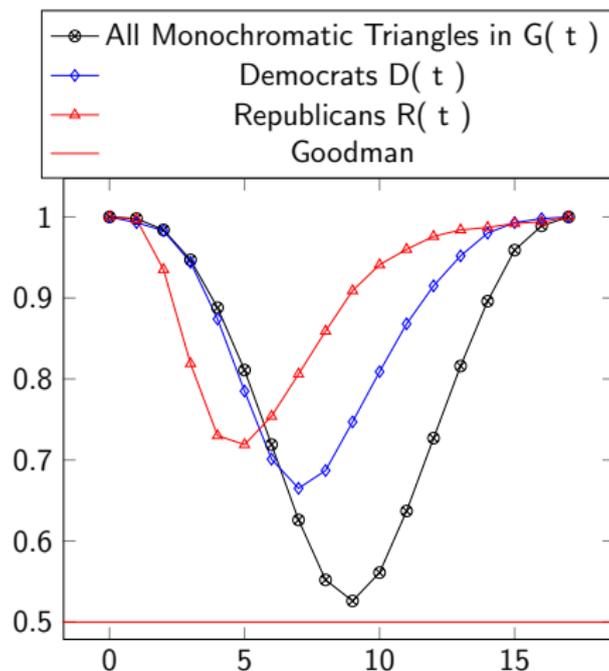
Advantages

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- 2 This picture is also a measure of how transitive the combined relations are.



Other “Goodman” theorems

- ① Schur triples (2 colours). $\frac{1}{22}$. Story starts with Graham-Rödl-Ruciński 1996, “ends” with Robertson-Zeilberger 2003.
- ② VdW (3 term, 2 colours). At least 25% of all 3-term such arithmetic progressions must be monochromatic. [Sjöland 2014, using Cameron-Celleruelo-Serra 2007]
- ③ VdW (4 term, 2 colours). $\frac{7}{96} < \frac{1}{16}$. [Lu-Peng 2012, building off Wolf 2010]
- ④ See also work of Parillo-Robertson-Saracin 2008, Butler-Costello-Graham 2010.

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Question 2

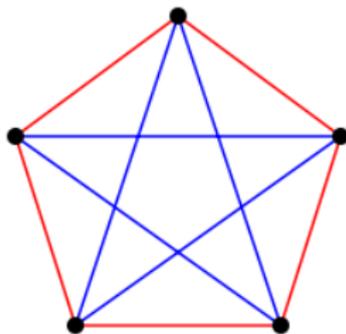
What is a “physical” interpretation of monochromatic arithmetic progressions in a large data set?

Story 3: Bad colourings



Artist: M. Pawliuk (Age: 31).

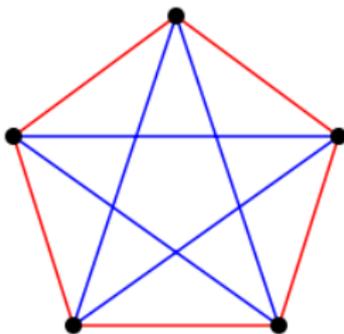
$$R(3, 3) > 5$$



Observation

There is an edge colouring of K_5 without a monochromatic K_3 , but *most* edge colourings *do* have a monochromatic triangle.

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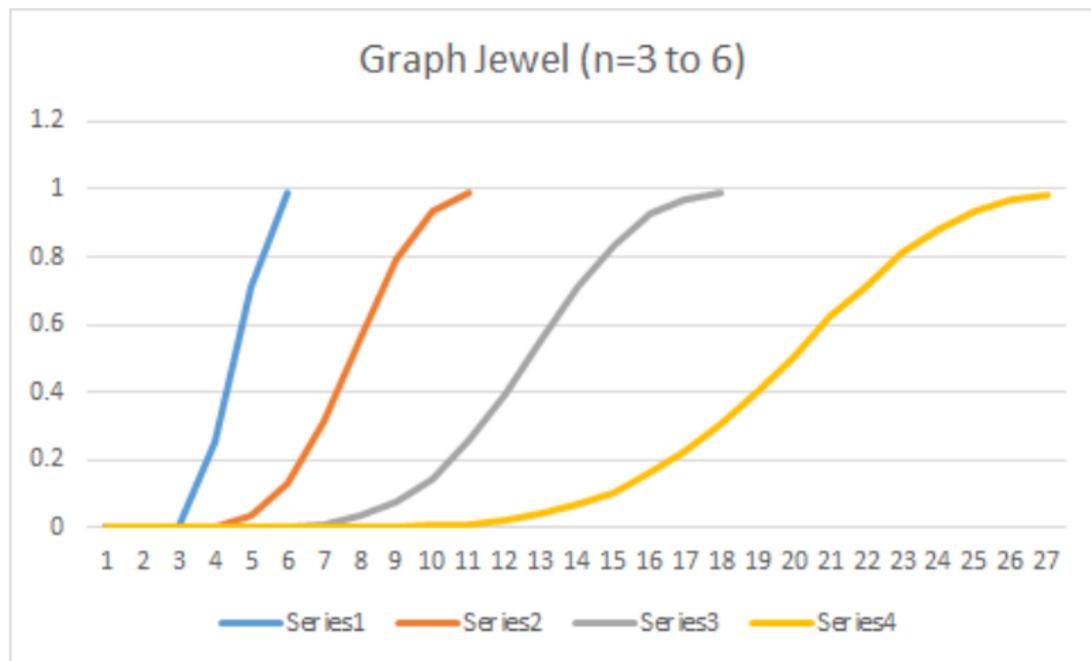
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[
noframenumbering]Major Question

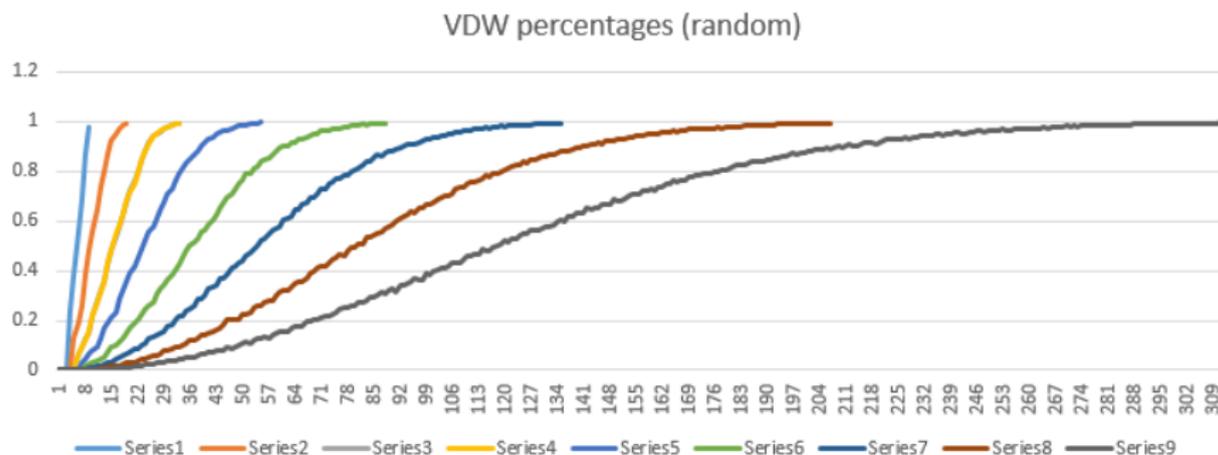
Given a Ramsey-style result, as the size n of the data set grows, what percentage of colourings have monochromatic witnesses?

Ramsey's Theorem



See Robertson-Cipolli-Dascălu 2017 for descriptions of these distributions.

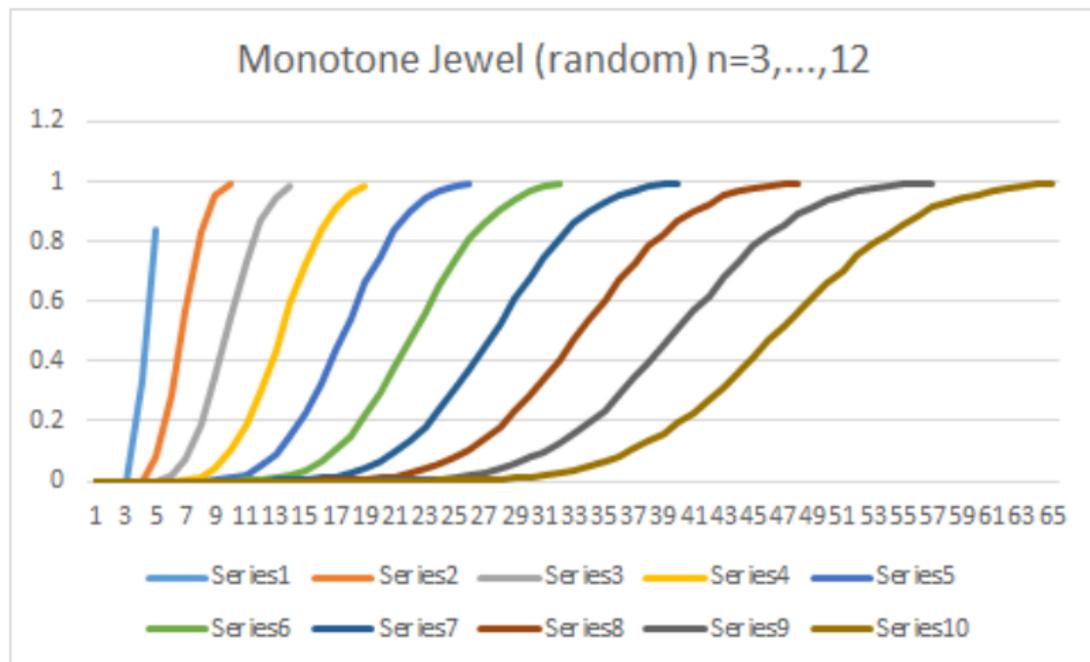
VdW. Arithmetic progressions of length n



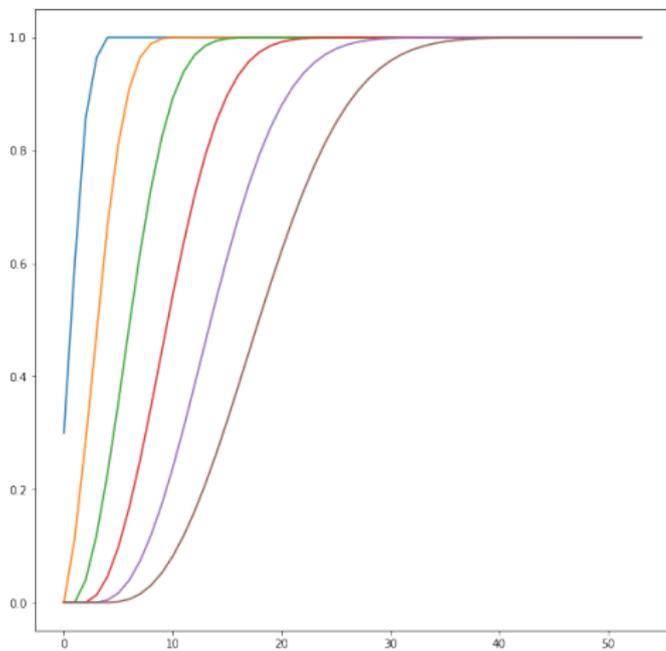
AP of lengths 3 to 10.

See Robertson-Cipolli-Dascălu 2017 for descriptions of these distributions.

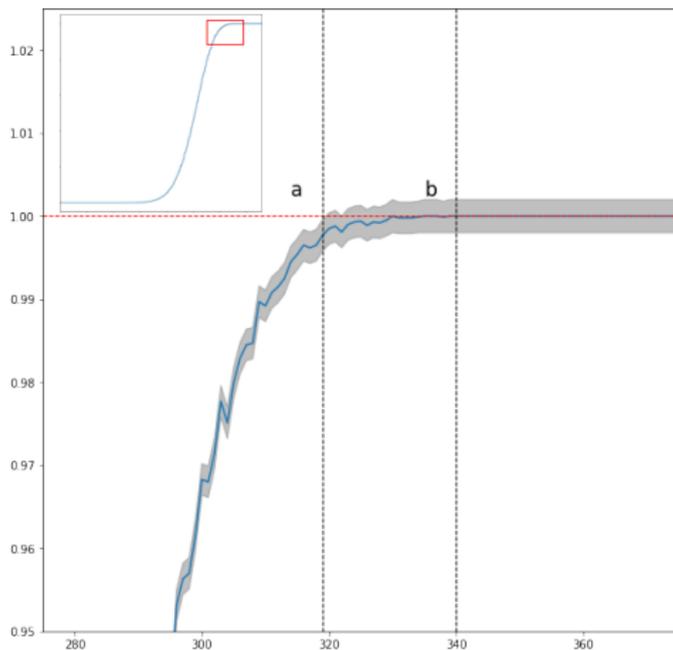
Erdős-Szekeres. Monotone subsequence of length n



Partitions of n objects into N boxes, with at least one box with N objects

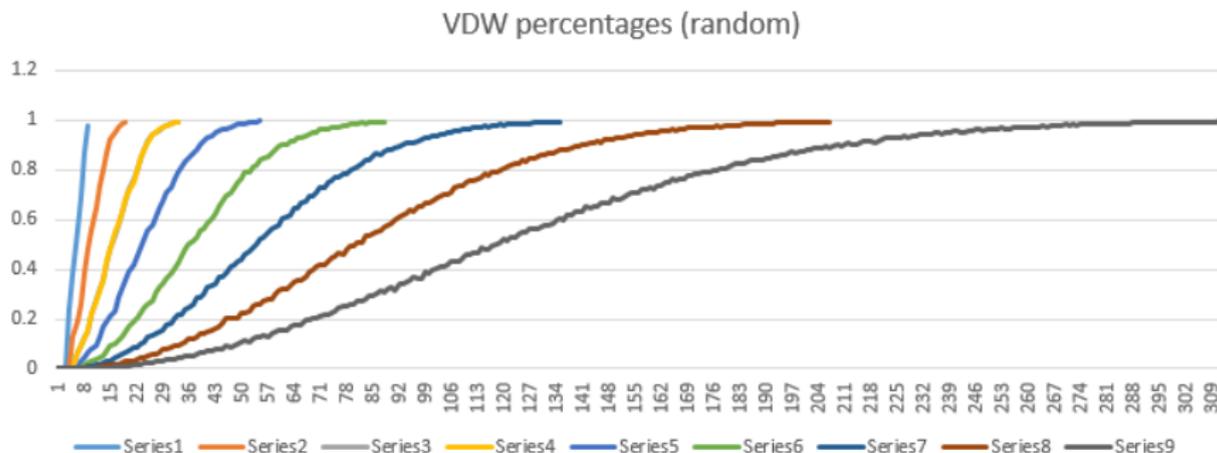


$N = 20$



The jaggedness is not noise! It is an essential feature of the graph.

Machine learning and classifiers



Using **one** of these distributions gives you an okay way to classify/partition graphs. Using **many** of these distributions gives you a better way to classify graphs.

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Can these distributions be written in the form “Nice” + “Small”? Where “small” is because of something essential to the geometry of the structures?

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Call to action 1

Results in this area need to be made accessible to data scientists. We need to (if possible) include digestible results.

Call to action 2

Talk to a statistician and a data scientist.