

Randomness

Dr. Carmen Bruni

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Applications

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University of Waterloo

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Let's Play a Game

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Suppose you play a coin flipping game with a friend. It costs a dollar to play. Each time heads is flipped you lose your dollar and each time tails is flipped you win 10 dollars. Being a good mathematician you agree to play. You play the game 30 times and your friend leaves, flips the coin and tells you the results:



Let's Play a Game

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Suppose you play a coin flipping game with a friend. It costs a dollar to play. Each time heads is flipped you lose your dollar and each time tails is flipped you win 10 dollars. Being a good mathematician you agree to play. You play the game 30 times and your friend leaves, flips the coin and tells you the results:

ННННННННННННННННННННННН

You lost every time! You say to your friend that he cheated! Your friend claims he didn't. Do you think he cheated? Why?



Which is more random?

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Suppose we take a fair coin and flip it 30 times. Which of the following is more random? Why?

- **1** ННННННННННННННННННННННННН
- **3** THHTHTTTTHTHTTTTHTHTTTTHT
- O HTHTTHHHTHTHHTTHHTTHHTHTHTHTH



Which is more random?

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- **3** THHTHTTTTHTHTTTHTHTTTTHT
- HTHTTHHHTHTHHTTHHTTHHTHTHTHTH

But which is more probable?



Which is more random?

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Suppose we take a fair coin and flip it 30 times. Which of the following is more random? Why?

- **3** THHTHTTTTHTHTTTHTHTTTTHT
- HTHTTHHHTHTHHTTHHTTHHTHTHTHTH

But which is more probable? They all have the same probability! $(1/2^{30})$



Kolmogorov

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This phenomenon has been known for a while. Andrey Kolmogorov (1903-1987) was one of the first people to give a way to measure this. He defined a concept known today as Kolmogorov Complexity.





Kolmogorov Complexity

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Define the *Kolmogorov Complexity* of a string as the length of the minimum length computer program needed to output the string.



Kolmogorov Complexity

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Define the *Kolmogorov Complexity* of a string as the length of the minimum length computer program needed to output the string.

- The idea here is if there is a description of the string that is shorter than just writing the string itself, then the string is not random.
- This of course depends on the program you use but one can show that differences in programs only introduce a small difference in the lengths of the programs which as the sample (input) size gets large becomes negligible.



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Let's look at the original examples:

Example 1: HHHHHHHHHHHHHHHHHHHHHHHHHHHHHHHHH

This is not very random since we could write a program like

for i in range(30): print "H"



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Let's look at the original examples:

Example 2: HTHTHTHTHTHTHTHTHTHTHTHTHTHT

This is also not very random since we could write a program like

for i in range(15): print "HT"



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Let's look at the original examples:

Example 3: THHTHTHTTHTHTHTTHTHTTTTHT

This is also not very random even though it might seem very random.



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Let's look at the original examples:

Example 3: THHTHTHTTHTHTHTHTHTTTHT

This is also not very random even though it might seem very random.

```
for i in range(30):
if is_prime(i): print "H" else print "T"
```



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Let's look at the original examples:

Example 4: HTHTTHHHTHHTHHTHHTHHTHTHH

This example doesn't contain any noticeably large patterns (hopefully!)

print "HTHTTHHHTHTHHTHHTHHTHTHTH"



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Kolmogorov Complexity has applications in many areas of mathematics:

- Computer Science (Shell Sort Average Case Runtime, Formal Language Theory, etc.)
- Combinatorics and Optimization (Tournaments, lower bounds on Ramsey Numbers, Constructive proof of the Lovász Local Lemma etc.)
- Number Theory (Infinitely many primes, Asymptotic Prime Number Theorem etc.)
- Philosophy, Logic (Unprovability of a number being random, etc.)
- Biology (Complex Systems, Sequence Similarity, etc.)
- Statistics and Probability Theory (Probabilities of properties in random graphs, Measure Theory etc.)



Examples

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Theorem

The average case runtime of shell sort is order $n \log n$.

Theorem

Let r(k) be the least integer such that either a graph or it's complement has a clique (complete subgraph) of size k. Then

$$r(k) \ge k2^{k/2} \left(\frac{1}{e\sqrt{2}} - error \ term \right)$$

Examples

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Theorem

Suppose a tournament has the transitive property, that is, if A plays and defeats B and B plays and defeats C, then A plays and defeats C. Let v(n) be the maximum number of players v such that every tournament of size v has a transitive sub-tournament on v players. Then $v(n) \le 2\log(n) + 1$.

Theorem

Let $\pi(n) = \sum_{p \le n} 1$ be the function that counts the number of primes less than or equal to n. Then

$$\pi(n) \sim \frac{n}{\log n}$$
.



Where I Learned About This

Randomness

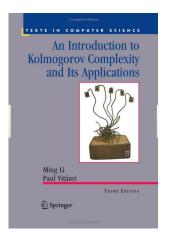
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Learned all about Kolmogorov Complexity in CS860 here at the University of Waterloo from Ming Li.







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A Mathematics Faculty



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- A Mathematics Faculty
- Large student populations means that more courses can be offered.



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- A Mathematics Faculty
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- Consequently, many more opportunities for friendships and collaborators.



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- Can combine many interests and degrees (I for example combined CS and Pure Mathematics).



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- UWaterloo is well known; many of my job offers I've received were from people who knew the quality of education you get here.



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- City is built around students; everything is conveniently located. Lots of restaurants and pubs (when you're old enough!). Low cost of living.



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- City is built around students; everything is conveniently located. Lots of restaurants and pubs (when you're old enough!). Low cost of living.
- Many of my friends went on to very successful careers and many obtained doctorates in mathematics.