#### Complexity, disorder, information, chance

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> University of Tartu November 15, 2022

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#### Outline

- 1. Plan
- 2. Talk

### Plan

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# Complexity

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#### 0,1 sequences

The *complexity function* of a sequence, system, or set of configurations is

 $N_n$  = number of size-*n* "blocks".

1. Periodic

$$01010101\dots$$
$$h = \lim_{n \to \infty} \frac{\log N_n}{n} = 0$$

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#### 2. Substitutions

$$0 \to 01, 1 \to 0$$
  
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 $h = 0$   
 $N_n = n + 1$  for all  $n \ge 1$ 

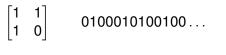
Not periodic, but long-range order, recurrence.

Exercise: If  $N_n$  is bounded for a sequence, then the sequence is eventually periodic:  $x = A \quad B^{\infty}$ .



3. Shifts of finite type (topological Markov chains) No 11:





$$h = \log \lambda_{\max} > 0$$

Exponential growth rate of the number of paths in the graph.

$$N_{n+1}=N_n+N_{n-1}$$

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#### Full shift, $\Sigma_2$ :



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#### 0110001011101001111...

 $h = \log 2$ 

### Kolmogorov complexity

length of the shortest program (for a universal Turing machine) that produces the (finite) string

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 $(01)^\infty$  is an instruction that produces the infinite sequence 0101010101...

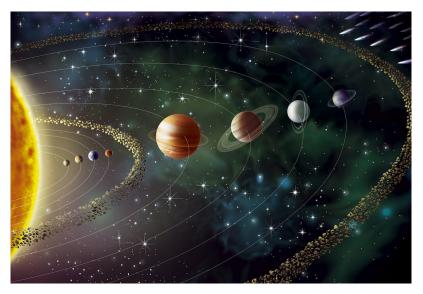
The program is like a theory of observed phenomena-

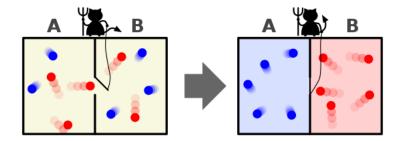
a compression of data.



## Disorder







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Given enough time, many small Maxwell demons can appear by chance and, using ambient energy, divert parts of a system toward unlikely states.

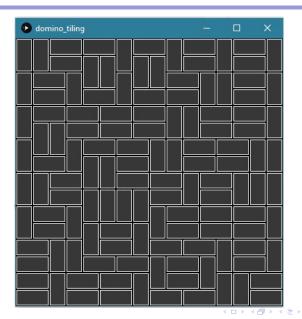
A nebula can contract under gravity, but it is unlikely to have total angular momentum zero.

Rotation, gravity, and random particle collisions cause flattening to a disk with fairly uniform angular velocities.

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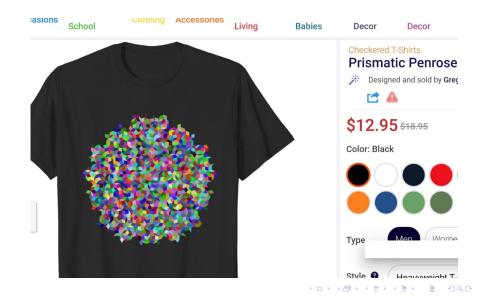
Random irregularities sweep up particles by collisions and gravity, leading to stars and planets.

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## Information

Claude Shannon, 1948:

When we are told that an event A that has probability P(A) has occurred, the amount of *information gained* is

 $-\log_2 P(A)$  bits.

This equals the *uncertainty removed*.

Information is measured in the number of binary digits (answers to yes-no questions) needed to convey it.

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#### Claude Shannon



Signals can be *compressed*, subject to how much average information per symbol they contain, which is called the *entropy of the source*:

$$h(\mathcal{X}) = \lim_{n \to \infty} \left[ -\frac{1}{n} \sum_{B \in D^n} P(B) \log_2 P(B) \right]$$
$$= \lim_{n \to \infty} \left[ -\frac{1}{n} \log_2 P(x_0 x_1 \dots x_{n-1}) \right]$$

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Why  $I(A) = -\log_2 P(A)$ ?

Additive for independent events.

Zero for certain events, large for improbable events.

Fechner's Law, 1860: The magnitude of the sensation produced by some stimulus is proportional to the logarithm of the intensity of the stimulus.

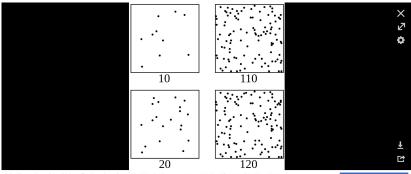
(In what *units* are sensation strength and stimulus intensity being measured?)

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#### **Gustav Theodor Fechner**



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An illustration of the Weber–Fechner law. On each side, the lower square contains 10 more dots than the upper one. However the perception is different: On the left side, the difference between upper and lower square is clearly visible. On I ...

LUnьин: vectorization - File:Weber-Fechner law demo - dots.png by MrPomidor

An illustration of the Weber-Fechner law. On each side, the lower square contains 10 more dots than the upper one. However the perception is different: On the left side, the difference between upper and lower square is clearly visible. On the right side, both squares look almost the same.  File: Weber-Fechner law demodots.svg
 Created: 2 January 2022

More details

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Boltzmann, c. 1875:

$$S = k \log W$$

The entropy of a macrostate X = (E, V, N) is proportional to the number *W* of compatible microstates.

W is a measure of our ignorance about the "inside" of the macrostate X, its complexity, its degree of disorder.

(When all microstates are assumed to be equally likely, each has probability P(A) = 1/W.)

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### Ludwig Boltzmann



Entropy (Macquom Rankine 1850, Rudolf Clausius 1865) can be defined to be a function of the values of the variables that specify a system that is *additive* with respect to subsystems:

$$S(X_1 \sqcup X_2) = S(X_1) + S(X_2).$$

It is postulated that when two systems are put in contact, the values of the variables for each system adjust so that at equilibrium S is at a maximum.

It follows that if they have different inverse temperatures

$$\beta = \left(\frac{\partial S}{\partial E}\right)_{N,V}$$

and are allowed to exchange energy but not to exchange particles, to reach equilibrium they equalize their temperatures.

Boltzmann sought to reduce thermodynamics to statistical mechanics.

### It from bit

John Archibald Wheeler, 1989: "It from bit."

Information encapsulates the program that generates stuff.

"We seek to understand all of physics in terms of information."

For example:

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the *long-range order* in a substitution sequence or Penrose tiling

the *theory* that explains a set of observations

an impulse that generates the realities that it describes?

Logos? Demiurge?

#### Einstein, Yukawa, Wheeler



#### John Archibald Wheeler



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In ancient Greek philosophy, *logos* was the principle of order and knowledge. (Heraclitus, Stoics)

John 1:1. *En arche en ho Logos, In principio erat verbum.* It is logos through which all things are made. Logos is an idea or plan in the mind of God.

Christ and Mohammed are seen as logos incarnate, intermediaries or messengers between humans and higher entities.

Faust: Geschrieben steht: "Im Anfang war das Wort". ... der Sinn ... die Kraft ... Mir hilft der Geist! Auf einmal seh' ich Rat und schreibe getrost: Im Anfang war die Tat!

Torsten Larbig: The verb is the door to the information that lets a sentence exist.

- Information

#### Heraclitus



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Nürnberg Chronicle, 1493

#### Heraclitus



From the Villa of the Papyri, Herculaneum National Archaeological Museum, Naples

idea  $\stackrel{\text{word}}{\longrightarrow} \,$  action

- $\logos \longrightarrow world$
- program  $\longrightarrow$  data
  - theory  $\longrightarrow$  experiment

Science seeks to reverse the process.

Science is *knowledge*, not just of a collection of facts, but of a *design* (theory) that "explains" the facts by giving them coherence.



### Chance

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#### Chance

A possible source of chance is coarse-graining.

Our imperfect perception and measuring capabilities necessarily leave us ignorant of the properties of an occurring microstate inside of our observed macrostate.

A photon encountering a beam splitter can either be reflected or not, and we don't know which happens until it hits a detector.

So we say that it is in a mixture of states, each with probability 1/2. Ignorance also comes from quantum entanglement.

When we are about to roll a die and don't know what number might come up, we say that each has probability 1/6.

Such statements are supported by the evidence of repeated trials. (Frequentism vs. subjectivism.)

#### Conclusion

Second Law of Thermodynamics: Entropy tends to increase.

John von Neumann to Claude Shannon: "You should call it entropy, for two reasons. In the first place your uncertainty function has been used in statistical mechanics under that name, so it already has a name. In the second place, and more importantly, no one really knows what entropy really is, so in a debate you will always have the advantage."

Complexity and disorder both promote (or arise from) *ignorance* (lack of information=entropy).

So does chance.

Complexity, disorder, information, chance are deep and slippery ideas.

But they are subject to study by mathematics.

Sometimes progress can be made by *separating* structure and randomness and analyzing the effects of each.

Examples: Furstenberg's proof of Szemerédi's Theorem (every positive density set of natural numbers contains arbitrarily long arithmetic progressions), ergodic theorems, Austin's recent proof of the Weak Pinsker Conjecture, etc.

Intricacy (Sporns, Tononi, Edeleman 1994): Maximum effectiveness is achieved by *combining* (balancing) freedom and order.

Brain, society, etc.

-Chance



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(Credits: Wikipedia, and the internet in general.)