

How to Reconcile Randomness with Physicists' Belief that Every Theory Is Approximate: Informal Knowledge Is Needed

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1. What Sequences of Measurement Results Can We Expect

- The usual analysis of algorithms and computability takes into account what we can compute “from scratch”.
- Namely, we only use the given input and performing appropriate computational steps.
- In principle, in addition to the given input, we could also use the results of physical experiments.
- We normally do not use these results when performing unrelated computations.
- We do not expect the results of physical experiments to help us solve unrelated complex problems.

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2. What Sequences Measurement Results Can We Expect (cont-d)

- It would be very strange to find, e.g.:
 - a radioactive material
 - whose emissions will solve a given NP-hard problem like propositional satisfiability.
- We may get some help in solving this problem:
 - from other people,
 - maybe from signals sent to us by an alien civilization – in short, from someone with intelligence.
- However, we do not expect such help from an (unintelligent) physical process.
- This idea was formalized by L. Levin in terms of *Kolmogorov complexity*.
- Let us briefly recall the corresponding formalization.

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3. Kolmogorov Complexity: A Brief Reminder

- Computers can process many different types of objects – arrays, graphs, images, videos, etc.
- However, in a computer, every object is represented as a sequence of 0s and 1s, i.e., as a *binary sequence*.
- Kolmogorov complexity was invented to formalize another intuitive idea: of a random binary sequence.
- From the purely mathematical viewpoint:
 - if we consequently flip a coin and write down all heads as 1s and all tails as 0s,
 - then all length- n sequences of 0s and 1s have the exact same probability 2^{-n} .
- From this viewpoint, they are equally probable and thus, seem to have an equal right to be called random.

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4. Kolmogorov Complexity (cont-d)

- In particular, for a large n :
 - a sequence that we will actually get after flipping the coin n times has the same probability as
 - the sequence 0101...01, in which the sequence 01 is repeated many times.
- However, intuitively:
 - the seemingly lawless sequence that we will actually get after flipping a coin looks random, while
 - the sequence 0101...01 does not look random
 - and it would be very surprising if such a sequence indeed appears as a result of flipping a coin.

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5. Kolmogorov Complexity (cont-d)

- Moreover:
 - if something like this sequence will be observed in a casino,
 - after a while we will be absolutely sure that cheating is taking place, and
 - that the corresponding slot machine is not truly random (as it is supposed to be).
- Kolmogorov noticed that there is a difference between:
 - sequences which are intuitively random and
 - sequences which are not intuitively random.

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6. Kolmogorov Complexity (cont-d)

- The reason why we do not believe that the sequence 0101...01 is truly random is that:
 - this sequence can be generated by a reasonably short program,
 - in which we print 01 in a loop.
- On the other hand:
 - if we consider a real sequence of 0s and 1s obtained by flipping a coin,
 - we do not expect to find any regularity there,
 - so the only way to generate this sequence is to print it bit-by-bit.
- The length of such a program is practically equal to the length $\text{len}(x)$ of the binary string.

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7. Kolmogorov Complexity (cont-d)

- To describe this difference in precise terms, Kolmogorov introduced the notion of Kolmogorov complexity $C(x)$.
- It is the shortest length of a program (in a fixed programming language) that generates the string x .
- In these terms, if $C(x) \ll \text{len}(x)$, this sequence is not random.
- On the other hand:
 - if $C(x) \approx \text{len}(x)$ – or, to be more precise, if $C(x) \geq \text{len}(x) - c$ for some small c ,
 - then we can say that the sequence x is random.

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8. Prefix Kolmogorov Complexity

- The above definition of randomness can be made even more intuitive if we take into account that:
 - we can flip the coin as many times as we want, so
 - the coin-flipping sequence can be extended to any length.
- The fact that we stopped should not change our opinion on whether this sequence is random or not.
- From this viewpoint:
 - if it is not so easy to generate the binary sequence that we have so far, but
 - much easier to generate its extension,
 - then the resulting sequence should still be marked as not random.

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9. Prefix Kolmogorov Complexity (cont-d)

- Generating an extension can be easier than the sequence itself; for example:
 - to generate a sequence 001001...001001 is somewhat easier than
 - its initial segment 001001...00100 when we need to take special care of the last two 0s.
- So, we need to replace the original Kolmogorov complexity $C(x)$ with *prefix Kolmogorov complexity* $K(x)$.
- $K(x)$ is the shortest length of the program that generates either x or a sequence starting with x .

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10. Conditional Kolmogorov Complexity And the Notion of Information

- We are interested in how using an auxiliary sequence y can potentially affect our computations.
- In principle:
 - when we use the bits from the given sequence y ,
 - we do not need to compute them and thus,
 - it may be possible to have a shorter program for computing x .
- An analogy is that if we already have a program for computing $\sin(x)$, then computing $\sin^2(x)$ is fast.

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11. Conditional Kolmogorov Complexity (cont-d)

- All you need to do is access the value of the sine and square it; in contrast:
 - if we needed to compute $\sin^2(x)$ “from scratch”, by using only arithmetic operations,
 - we would need to perform a dozen or so operations
 - which would necessitate a much longer program.
- From this viewpoint, it is reasonable to consider program for which:
 - an access to the i -th bit from the sequence y
 - can be done by simply writing something like $y[i]$.
- The shortest length of such using-calls-to- y program is known as the *conditional prefix Kolmogorov complexity*.
- It is usually denoted by $K(x|y)$.

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12. Conditional Kolmogorov Complexity (cont-d)

- In these terms:
 - the fact that the use of y should not make computing x easier means that
 - the complexity $K(x|y)$ should not be much smaller than the complexity of computing x w/o using y ,
 - i.e., that we should not have $K(x|y) \ll K(x)$.
- Possibly using y does not mean that we have to; so:
 - when we compute $K(x|y)$, we consider all possible programs for computing x ,
 - including programs that do not use y at all.
- Thus, $K(x|y) \leq K(x)$; so, the difference $K(x) - K(x|y)$ must be non-negative.
- This difference is known as *information* in y about x ; it is denoted by $I(x : y)$.

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13. Conditional Kolmogorov Complexity (cont-d)

- Similarly to the definition of randomness:
 - the fact that using y should not affect our ability to compute x
 - can be described as $I(x : y) \leq c$ for some small $c > 0$.

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14. Levin's Formalization of the Above Intuitive Idea

- We want to formalize the commonsense idea that:
 - the results of physical experiments
 - should not help us solve mathematical problems.
- All mathematics can be (and have been) formulated in terms of set theory ST.
- For example, it can be formulated in terms of the usual Zermelo-Frenkel axiomatics ZF.
- In these terms:
 - solving a mathematical problem
 - i.e., checking whether a given mathematical statement is true or not
 - is equivalent to checking whether a given statement from ST is true or not.

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15. Levin's Formalization (cont-d)

- Some mathematical problems are computational, not about proving results.
- Such problems can also be described in these terms.
- Namely, if we want to compute the value of a real number (such as π), this means that:
 - for each n , we must find out
 - whether the n -th digit in the binary expansion of this number is 0 or 1, and
 - the fact that the n -th digit is 1 is a mathematical statement that can be formalized in ST.
- Each statement from ST is a finite combination of symbols.
- So in a computer, it is represented as a sequence of 0s and 1s.

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16. Levin's Formalization (cont-d)

- This sequence, in its turn, can be interpreted as a natural number.
- Moreover, it is easy to check:
 - whether a given natural number – i.e., in effect, a given sequence of 0s and 1s
 - is a syntactically correct statement of set theory.
- Thus:
 - by trying all possible natural numbers $0, 1, 2, \dots$, and
 - checking whether each of them is a syntactically correct statement of set theory,
 - we can enumerate all possible such statements into a sequence S_1, S_2, \dots

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17. Levin's Formalization (cont-d)

- In these terms, perfect mathematical knowledge can be represented by an infinite binary sequence $\alpha = \alpha_1\alpha_2\dots$
- Here $\alpha_i = 1$ if and only if the i -th statement α_i is true.
- Similarly, all possible observation and measurement results can also be placed in a single binary sequence.
- Indeed, each observation and measurement result has to be represented in a computer.
- It can, thus, be naturally represented as a sequence of 0s and 1s.
- Each measurement result can thus be described as a sequence of bits.
- Descriptions of the experimental and observational settings (*metadata*) can also be described in a computer.

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18. Levin's Formalization (cont-d)

- So, for each bit of each measurement result, we have a description, e.g.,

“the 5-th bit of measuring wind speed at UTEP
campus at 12 pm on August 27, 2019”.

- We can similarly sort such descriptions, and get a potentially infinite binary sequence $\omega = \omega_1\omega_1 \dots$
- Of course, this sequence is only *potentially* infinite.
- At any given moment of time:
 - we have only finitely many measurement and observation results, and
 - thus, we only know a finite part of this potentially infinite sequence.

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19. Levin's Formalization (cont-d)

- Levin's formalization of the above commonsense idea is that for every m and n :
 - using the first m bits of the measurement-results sequence $\omega_{1:m} \stackrel{\text{def}}{=} \omega_1 \dots \omega_m$
 - does not help us compute the truth values $\alpha_{1:n} \stackrel{\text{def}}{=} \alpha_1 \dots \alpha_n$ of the first n statements of set theory.
- We already know how to formalize this “inability to help”.
- Thus, we get the following precise description.
- There exists a small integer $c > 0$ for which, for all m and n , we have $I(\alpha_{1:n} : \omega_{1:m}) \leq c$.
- Levin called this formalization the *Independence Postulate*.

20. This Formalization Is in Perfect Accordance with Modern Physics

- According to modern (quantum) physics, the system's state is described by a wave function.
- We have deterministic equations describing the dynamics of the wave function.
- The state determines the probability of different measurement results.
- The actual sequence of measurement results is random with respect to the corresponding probability measure.
- For such sequence ω , Levin's Independence Postulate is indeed true.
- In this sense, Levin's Independence Postulate is in perfect accordance with modern physics.

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21. Every Theory Is Approximate

- Many physicists have yet another intuition, that:
 - no matter what theory we formulate,
 - no matter how well this theory describes the current experimental results,
 - this theory will eventually turn out to be only a good approximation,
 - there will be new experiments, new data that will require a modification of this theory.
- This happened with Newton's mechanics.
- It needed to be modified to take into account relativistic and quantum effects.
- This will happen – many physicists believe – with modern relativistic quantum physics as well.

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22. Formalizing This Belief

- In general, the above belief means that:
 - whatever physical law we come up with which is consistent with all physical experiments and observations so far,
 - eventually we will come up with experimental data that violates this law.
- In terms of our notations:
 - currently available results of experiments and observations
 - simply form an initial fragment $\omega_{1;n}$ of the potentially infinite sequence ω of all such results.

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23. Formalizing This Belief (cont-d)

- From the mathematical viewpoint, a physical law is simply a property $P(\omega_{1:n})$ that:
 - limits possible values of such fragments
 - to those that satisfy this property.
- Thus, the above physicists' belief is that:
 - for each such property P , there exists an integer M
 - corresponding to some future moment of time,
 - at which the fragment $\omega_{1:M}$ will *not* satisfy the corresponding property P .

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24. Resulting Challenge

- In particular, the physicists' belief means that:
 - no matter what constant c we select in our description of Levin's Independence Principle,
 - there will be a value M for which this principle will be violated, i.e., for which we will have

$$I(\alpha_{1:n}, \omega_{1:M}) > c.$$

- So, contrary to the physicists' intuition (and to modern physics):
 - under this belief,
 - a sequence of observations can't be random.

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25. Resulting Challenge (cont-d)

- In other words, the two physicists' intuitions are not fully compatible:
 - the intuition about randomness and
 - the intuition about infinite progress of physics.
- How can we reconcile these two intuitions?

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26. How to Reconcile the Two Intuitions: Suggestion And Challenges

- Due to the second (progress-of-science) intuition:
 - we cannot require – as Levine did,
 - that all the values of the information $I(\alpha_{1:n}, \omega_{1:m})$ are bounded by a constant.
- However, intuitively, the first (randomness) intuition tell us that:
 - we cannot expect too much information above complex statements
 - by simply looking at nature.
- We cannot require that the amount of information $I(\alpha_{1:n}, \omega_{1:m})$ be bounded.
- But we *can* require that this amount should be *small* – i.e., it should not grow too fast with m .

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27. How to Reconcile the Intuitions (cont-d)

- This idea is informal, can we formalize it?
- Unfortunately, not really; if we:
 - select some slowly growing function $c(m)$ and require that $I(\alpha_{1:n}, \omega_{1:m}) \leq c(m)$,
 - we will have the same problem as with the original Levin's Independence Postulate
 - that, according to the progress-of-science intuition, this inequality will be violated for some M .
- Thus, the only way to reconcile the two intuitions is to make an informal statement.
- Thus, *there are fundamental reasons why informal knowledge is needed for describing the real world.*

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