# The Mathematical Universe\*

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I explore physics implications of the External Reality Hypothesis (ERH) that there exists an external physical reality completely independent of us humans. I argue that with a sufficiently broad definition of mathematics, it implies the Mathematical Universe Hypothesis (MUH) that our physical world is an abstract mathematical structure. I discuss various implications of the ERH and MUH, ranging from standard physics topics like symmetries, irreducible representations, units, free parameters and initial conditions to broader issues like consciousness, parallel universes and Gödel incompleteness. I hypothesize that only computable and decidable (in Gödel's sense) structures exist, which alleviates the cosmological measure problem and help explain why our physical laws appear so simple. I also comment on the intimate relation between mathematical structures, computations, simulations and physical systems.

#### I. INTRODUCTION

The idea that our universe is in some sense mathematical goes back to the Pythagoreans, and has been extensively discussed in the literature (see, e.g., [2–24]). Galileo Galilei stated that the Universe is a grand book written in the language of mathematics, and Wigner reflected on the "unreasonable effectiveness of mathematics in the natural sciences" [3]. In this essay, I will push this idea to its extreme and argue that our universe is mathematics in a well-defined sense. After elaborating on this hypothesis and underlying assumptions in Section II, I discuss a variety of its implications in Sections III-VII. This paper can be thought of as the sequel to one I wrote in 1996 [12], clarifying and extending the ideas described therein.

#### II. THE MATHEMATICAL UNIVERSE HYPOTHESIS

# A. The External Reality Hypothesis

In this section, we will discuss the following two hypotheses and argue that, with a sufficiently broad definition of mathematical structure, the former implies the latter.

External Reality Hypothesis (ERH): There exists an external physical reality completely independent of us humans.

Mathematical Universe Hypothesis (MUH): Our external physical reality is a mathematical structure.

Although many physicists subscribe to the ERH and dedicate their careers to the search for a deeper understand-

ing of this assumed external reality, the ERH is not universally accepted, and is rejected by, e.g., metaphysical solipsists. Indeed, adherents of the Copenhagen interpretation of quantum mechanics may reject the ERH on the grounds that there is no reality without observation. In this paper, we will assume that the ERH is correct and explore its implications. We will see that, although it sounds innocuous, the ERH has sweeping implications for physics if taken seriously.

Physics theories aim to describe how this assumed external reality works. Our most successful physics theories to date are generally regarded as descriptions of merely limited aspects of the external reality. In contrast, the holy grail of theoretical physics is to find a *complete* description of it, jocularly referred to as a "Theory of Everything", or "TOE".

The ERH implies that for a description to be complete, it must be well-defined also according to non-human sentient entities (say aliens or future supercomputers) that lack the common understanding of concepts that we humans have evolved, e.g., "particle", "observation" or indeed any other English words. Put differently, such a description must be expressible in a form that is devoid of human "baggage".

# B. Reducing the baggage allowance

To give a few examples, Figure 1 illustrates how various theories can be crudely organized in a family tree where each might, at least in principle, be derivable from more fundamental ones above it. All these theories have two components: mathematical equations and "baggage", words that explain how they are connected to what we humans observe and intuitively understand. Quantum mechanics as usually presented in textbooks has both components: some equations as well as three fundamental postulates written out in plain English. At each level in the hierarchy of theories, new concepts (e.g., protons, atoms, cells, organisms, cultures) are introduced because they are convenient, capturing the essence of what is going on without recourse to the more funda-

<sup>\*</sup>Partly based on a talk given at the symposium "Multiverse and String Theory: Toward Ultimate Explanations in Cosmology" held on 19-21 March 2005 at Stanford University and on the essay [1].

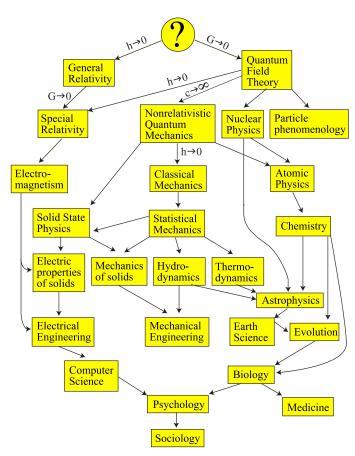


FIG. 1: Theories can be crudely organized into a family tree where each might, at least in principle, be derivable from more fundamental ones above it. For example, classical mechanics can be obtained from special relativity in the approximation that the speed of light c is infinite, and hydrodynamics with its concepts such as density and pressure can be derived from statistical mechanics. However, these cases where the arrows are well understood form a minority. Although chemistry in principle should be derivable from quantum mechanics, the properties of some molecules are so complicated to compute in practice that a more empirical approach is taken. Deriving biology from chemistry or psychology from biology would be even more hopeless in practice.

mental theory above it. It is important to remember, however, that it is we humans who introduce these concepts and the words for them: in principle, everything could have been derived from the fundamental theory at the top of the tree, although such an extreme reductionist approach appears useless in practice. Crudely speaking, the ratio of equations to baggage decreases as we move down the tree, dropping near zero for highly applied fields such as medicine and sociology. In contrast, theories near the top are highly mathematical, and physicists are still struggling to articulate the concepts, if any, in terms of which we can understand them. The MUH implies that the TOE indicated by the question mark at the top is purely mathematical, with no baggage whatsoever.

As an extreme example of a "theory", the descrip-

tion of external reality found in Norse mythology involves a gigantic tree named Yggdrasil, whose trunk supports Earth. This description all on its own is 100% baggage, since it lacks definitions of "tree", "Earth", etc. Today, the baggage fraction of this theory could be reduced by describing a tree as a particular arrangement of atoms, and describing this in turn as a particular quantum field theory state. Moreover (see, e.g., [3]), physics has come to focus on the way the external reality works (described by regularities known as laws of physics) rather than on the way it is (the subject of initial conditions).

However, could it ever be possible to give a description of the external reality involving *no* baggage? If so, our description of entities in the external reality and relations between them would have to be completely abstract, forcing any words or other symbols used to denote them to be mere labels with no preconceived meanings whatsoever.

A mathematical structure is precisely this: abstract entities with relations between them. Familiar examples include the integers and the real numbers. We review detailed definitions of this and related mathematical notions in Appendix A. Here, let us instead illustrate this idea of baggage-free description with simple examples. Consider the mathematical structure known as the group with two elements, i.e., addition modulo two. It involves two elements that we can label "0" and "1" satisfying the following relations:

$$\begin{cases}
0+0=0\\ 0+1=1\\ 1+0=1\\ 1+1=0
\end{cases}$$
(1)

The two alternative descriptions

$$\begin{cases} e \times e = e \\ e \times a = a \\ a \times e = a \\ a \times a = e \end{cases}$$
 (2)

and

look different, but the identification "0"—"e"—"even", "1"—"a"—"odd", "+"—"×"—"and", "="—"="—"make" shows that they describe exactly the same mathematical structure, since the symbols themselves are mere labels without intrinsic meaning. The only intrinsic properties of the entities are those embodied by the relations between them.

Equation (2) suggests specifying the relations more compactly as a multiplication table. Alternatively, using the notation of equation (1), a tabulation of the values of the function "+" for all combinations of the two arguments reads

$$\begin{bmatrix} 0 & 1 \\ 1 & 0 \end{bmatrix} \tag{4}$$

Table 1 – Any finite mathematical structure can be encoded as a finite string of integers, which can in turn be encoded as a single bit string or integer. The same applies to computable infinite mathematical structures as discussed in Appendix A.

| Mathematical structure  | Encoding         |
|-------------------------|------------------|
| The empty set           | 100              |
| The set of 5 elements   | 105              |
| The trivial group $C_1$ | 11120000         |
| The polygon $P_3$       | 113100120        |
| The group $C_2$         | 11220000110      |
| Boolean algebra         | 11220001110      |
| The group $C_3$         | 1132000012120201 |

In Appendix A, we give our convention for encoding any finite mathematical structure, involving arbitrarily many entities, entity types and relations, as a finite sequence of integers. Our present example corresponds to "11220000110", and Table 1 lists a few other simple examples. Appendix A also covers infinite mathematical structures more relevant to physics, e.g., vector fields and Lie Groups, and how each of these can be encoded as a finite-length bit string. In all cases, there are many equivalent ways of describing the same structure, and a particular mathematical structure can be defined as an equivalence class of descriptions. Thus although any one description involves some degree of arbitrariness (in notation, etc.), there is nothing arbitrary about the mathematical structure itself.

Putting it differently, the trick is to "mod out the baggage", defining a mathematical structure by a description thereof modulo any freedom in notation. Analogously, the number 4 is well-defined even though we humans have multiple ways of referring to it, like "IV", "four", "quatro", "fyra", etc.

#### C. Implications for a Mathematical Universe

In summary, there are two key points to take away from our discussion above and in Appendix A:

- 1. The ERH implies that a "theory of everything" has no baggage.
- 2. Something that has a baggage-free description is precisely a mathematical structure.

Taken together, this implies the Mathematical Universe Hypothesis formulated on the first page of this article, *i.e.*, that the external physical reality described by the TOE is a mathematical structure. Before elaborating on this, let us consider a few historical examples to illustrate what it means for the physical world to be a mathematical structure:

- Newtonian Gravity of point particles: Curves in R<sup>4</sup> minimizing the Newtonian action.
- 2. **General Relativity:** A 3+1-dimensional pseudo-Riemannian manifold with tensor fields obeying partial differential equations of, say, Einstein-Maxwell-theory with a perfect fluid component.
- 3. Quantum Field Theory: Operator-valued fields on  $\mathbb{R}^4$  obeying certain Lorentz-invariant partial differential equations and commutation relationships, acting on an abstract Hilbert space.

(Of course, the true mathematical structure isomorphic to our world, if it exists, has not yet been found.)

When considering such examples, we need to distinguish between two different ways of viewing the external physical reality: the outside view or *bird perspective* of a mathematician studying the mathematical structure and the inside view or *frog perspective* of an observer living in it.

A first subtlety in relating the two perspectives involves time. Recall that a mathematical structure is an abstract, immutable entity existing outside of space and time. If history were a movie, the structure would therefore correspond not to a single frame of it but to the entire videotape. Consider the first example above, a world made up of classical point particles moving around in three-dimensional Euclidean space under the influence of Newtonian gravity. In the four-dimensional spacetime of the bird perspective, these particle trajectories resemble a tangle of spaghetti. If the frog sees a particle moving with constant velocity, the bird sees a straight strand of uncooked spaghetti. If the frog sees a pair of orbiting particles, the bird sees two spaghetti strands intertwined like a double helix. To the frog, the world is described by Newton's laws of motion and gravitation. To the bird, it is described by the geometry of the pasta, obeying the mathematical relations corresponding to minimizing the Newtonian action.

A second subtlety in relating the two perspectives involves the observer. In this Newtonian example, the frog (a self-aware substructure, or "SAS") itself must be merely a thick bundle of pasta, whose highly complex intertwining corresponds to a cluster of particles that store and process information. In the General Relativity example above, the frog is a tube through spacetime, a thick version of what Einstein referred to as a world-line. The location of the tube would specify its position in space at different times. Within the tube, the fields would exhibit complex behavior corresponding to storing

<sup>&</sup>lt;sup>1</sup> In the philosophy literature, the name "structural realism" has been coined for the doctrine that the physical domain of a true theory corresponds to a mathematical structure [4], and the name "universal structural realism" has been used for the hypothesis

that the physical universe is isomorphic to a mathematical structure [22].

and processing information about the field-values in the surroundings, and at each position along the tube, these processes would give rise to the familiar sensation of self-awareness. The frog would perceive this one-dimensional string of perceptions along the tube as passage of time. In the Quantum Field Theory example above, things become more subtle because a well-defined state of an observer can evolve into a quantum superposition of subjectively different states. If the bird sees such deterministic frog branching, the frog perceives apparent randomness [25, 26].

# D. Description versus equivalence

Let us clarify some nomenclature. Whereas the customary terminology in physics textbooks is that the external reality is described by mathematics, the MUH states that it is mathematics (more specifically, a mathematical structure). This corresponds to the "ontic" version of universal structural realism in the philosophical terminology of [14, 22]. If a future physics textbook contains the TOE, then its equations are the complete description of the mathematical structure that is the external physical reality. We write is rather than corresponds to here, because if two structures are isomorphic, then there is no meaningful sense in which they are not one and the same [19]. From the definition of a mathematical structure (see Appendix A), it follows that if there is an isomorphism between a mathematical structure and another structure (a one-to-one correspondence between the two that respects the relations), then they are one and the same. If our external physical reality is isomorphic to a mathematical structure, it therefore fits the definition of being a mathematical structure.

If one rejects the ERH, one could argue that our universe is somehow made of stuff perfectly described by a mathematical structure, but which also has other properties that are not described by it, and cannot be described in an abstract baggage-free way. This viewpoint, corresponding to the "epistemic" version of universal structural realism in the philosophical terminology of [14, 22], would make Karl Popper turn in his grave, since those additional bells and whistles that make the universe nonmathematical by definition have no observable effects whatsoever.

## E. Evidence for the MUH

Above we argued that the ERH implies the MUH, so that any evidence for the ERH is also evidence for the MUH. Before turning to implications of the MUH, let us briefly discuss additional reasons for taking this hypothesis seriously.

In his above-mentioned 1967 essay [3], Wigner argued that "the enormous usefulness of mathematics in the natural sciences is something bordering on the mysterious",

and that "there is no rational explanation for it". The MUH provides this missing explanation. It explains the utility of mathematics for describing the physical world as a natural consequence of the fact that the latter is a mathematical structure, and we are simply uncovering this bit by bit. The various approximations that constitute our current physics theories are successful because simple mathematical structures can provide good approximations of certain aspects of more complex mathematical structures. In other words, our successful theories are not mathematics approximating physics, but mathematics approximating mathematics.

The MUH makes the testable prediction that further mathematical regularities remain to be uncovered in nature. This predictive power of the mathematical universe idea was expressed by Dirac in 1931: "The most powerful method of advance that can be suggested at present is to employ all the resources of pure mathematics in attempts to perfect and generalize the mathematical formalism that forms the existing basis of theoretical physics, and after each success in this direction, to try to interpret the new mathematical features in terms of physical entities" [2]. After Galileo promulgated the mathematical universe idea, additional mathematical regularities beyond his wildest dreams were uncovered, ranging from the motions of planets to the properties of atoms. After Wigner had written his 1967 essay [3], the standard model of particle physics revealed new "unreasonable" mathematical order in the microcosm of elementary particles and in the macrocosm of the early universe. I know of no other compelling explanation for this trend than that the physical world really is completely mathematical.

#### F. Implications for Physics

The notion that the world is a mathematical structure alters the way we view many core notions in physics. In the remainder of this paper, we will discuss numerous such examples, ranging from standard topics like symmetries, irreducible representations, units, free parameters and initial conditions to broader issues like parallel universes, Gödel incompleteness and the idea of our reality being a computer simulation.

# III. PHYSICS FROM SCRATCH

Suppose we were given mathematical equations that completely describe the physical world, including us, but with no hints about how to interpret them. What would we do with them? Specifically, what mathematical analysis of them would reveal their phenomenology, *i.e.*, the properties of the world that they describe as perceived by observers? Rephrasing the question in the terminology of the previous section: given a mathematical structure, how do we compute the inside view from the outside

view? More precisely, we wish to derive the "consensus view" <sup>2</sup>.

This is in my opinion one of the most important questions facing theoretical physics, because if we cannot answer it, then we cannot test a candidate TOE by confronting it with observation. I certainly do not purport to have a complete answer to this question. This subsection merely explores some possibly useful first steps to take in addressing it.

By construction, the only tools at our disposal are purely mathematical ones, so the only way in which familiar physical notions and interpretations ("baggage") can emerge are as implicit properties of the structure itself that reveal themselves during the mathematical investigation. What such mathematical investigation is relevant? The detailed answer clearly depends on the nature of the mathematical structure being investigated, but a useful first step for any mathematical structure S is likely to be finding its  $automorphism\ group\ {\rm Aut}\ (S)$ , which encodes its symmetries.

# A. Automorphism definition and simple examples

A mathematical structure S (defined and illustrated with examples in Appendix A) is essentially a collection of abstract entities with relations (functions) between them [27]. We label the various sets of entities  $S_1, S_2, ...$  and the functions (which we also refer to as relations<sup>3</sup>)

 $R_1,\ R_2,\ \dots$  An automorphism of a mathematical structure S is defined as a permutation  $\sigma$  of the elements of S that preserves all relations. Specifically,  $R_i=R_i'$  for all functions with 0 arguments, R(a')=R(a)' for all functions with 1 argument, R(a',b')=R(a,b)' for all functions with 2 argument, etc., where ' denotes the action of the permutation. It is easy to see that the set of all automorphisms of a structure, denoted Aut (S), form a group. Aut (S) can be thought of as the group of symmetries of the structure, i.e., the transformations under which the structure is invariant. Let us illustrate this with a few examples.

The trivial permutation  $\sigma_0$  (permuting nothing) is of course an automorphism, so  $\sigma_0 \in \text{Aut}(S)$  for any structure. Mathematical structures which have no non-trivial automorphisms (i.e., Aut  $(S) = \{\sigma_0\}$ ) are called rigid and exhibit no symmetries. Examples of rigid structures include Boolean algebra (Section A 2 a), the integers and the real numbers. At the opposite extreme, consider a set with n elements and no relations. All n! permutations of this mathematical structure are automorphisms; there is total symmetry and no element has any features that distinguishes it from any other element.

For the simple example of the 3-element group defined by equation (A3), there is only one non-trivial automorphism  $\sigma_1$ , corresponding to swapping the two non-identity elements:  $e'=e,\ g_1'=g_2,\ g_2'=g_1$ , so Aut  $(S)=\{\sigma_0,\sigma_1\}=C_2$ , the group of two elements.

## B. Symmetries, units and dimensionless numbers

For a more physics-related example, consider the mathematical structure of 3D Euclidean space defined as a vector space with an inner product as follows:<sup>4</sup>

- $S_1$  is a set of elements  $x_{\alpha}$  labeled by real numbers  $\alpha$ ,
- $S_2$  is a set of elements  $y_{\mathbf{r}}$  labeled by 3-vectors  $\mathbf{r}$ ,
- $R_1(x_{\alpha_1}, x_{\alpha_2}) = x_{\alpha_1 \alpha_2} \in S_1$ ,
- $R_2(x_{\alpha_1}, x_{\alpha_2}) = x_{\alpha_1/\alpha_2} \in S_1$ ,
- $R_3(y_{\mathbf{r}_1}, y_{\mathbf{r}_2}) = y_{\mathbf{r}_1 + \mathbf{r}_2} \in S_2$ ,
- $R_4(x_\alpha, y_\mathbf{r}) = y_{\alpha \mathbf{r}} \in S_2$ ,
- $R_5(y_{\mathbf{r}_1}, y_{\mathbf{r}_2}) = x_{\mathbf{r}_1 \cdot \mathbf{r}_2} \in S_1$ .

Thus we can interpret  $S_1$  as the (rigid) field of real numbers and  $S_2$  as 3D Euclidean space, specifically the vector space  $\mathbb{R}^3$  with Euclidean inner product. By combining the relations above, all other familiar relations can be

<sup>&</sup>lt;sup>2</sup> As discussed in [16], the standard mental picture of what the physical world is corresponds to a third intermediate viewpoint that could be termed the consensus view. From your subjectively perceived frog perspective, the world turns upside down when you stand on your head and disappears when you close your eyes, yet you subconsciously interpret your sensory inputs as though there is an external reality that is independent of your orientation, your location and your state of mind. It is striking that although this third view involves both censorship (like rejecting dreams), interpolation (as between eye-blinks) and extrapolation (say attributing existence to unseen cities) of your inside view, independent observers nonetheless appear to share this consensus view. Although the inside view looks black-andwhite to a cat, iridescent to a bird seeing four primary colors, and still more different to a bee seeing polarized light, a bat using sonar, a blind person with keener touch and hearing, or the latest robotic vacuum cleaner, all agree on whether the door is open. The key current challenge in physics is deriving this semiclassical consensus view from the fundamental equations specifying the bird perspective. In my opinion, this means that although understanding the detailed nature of human consciousness is an important challenge in its own right, it is not necessary for a fundamental theory of physics, which, in the case of us humans, corresponds to the mathematical description of our world found in physics textbooks. It is not premature to address this question now, before we have found such equations, since it is important for the search itself — without answering it, we will not know if a given candidate theory is consistent with what we observe.

<sup>&</sup>lt;sup>3</sup> As discussed in Appendix A, this is a slight generalization of the customary notion of a relation, which corresponds to the special case of a function mapping into the two-element (Boolean) set

 $<sup>\{0,1\}</sup>$  or  $\{False, True\}$ .

<sup>&</sup>lt;sup>4</sup> A more careful definition would circumvent the issue that  $R_2(x_0, x_0)$  is undefined. We return to the issue of Gödel-completeness and computability for continuous structures in Section VII

generated, for example the origin  $R_1(x_\alpha, x_\alpha) = x_0$  and multiplicative identity  $R_2(x_{\alpha}, x_{\alpha}) = x_1$  in  $S_1$  together with the additive inverse  $R_1(R_1(x_\alpha, x_\alpha), x_\alpha) = x_{-\alpha}$  and the multiplicative inverse  $R_4(R_2(x_\alpha, x_\alpha), x_\alpha) = x_{\alpha^{-1}}$ , as well as the 3D origin  $R_2(R_1(x_\alpha, x_\alpha), y_r) = y_0$ . This mathematical structure has rotational symmetry, i.e., the automorphism group Aut (S) = O(3), parametrized by  $3 \times 3$  rotation matrices **R** acting as follows:

$$x'_{\alpha} = x_{\alpha}, \qquad (5)$$
  
$$x'_{r} = x_{\mathbf{Rr}}. \qquad (6)$$

$$x_{\mathbf{r}}' = x_{\mathbf{Rr}}. (6)$$

To prove this, one simply needs to show that each generating relation respects the symmetry:

$$R_{3}(x'_{\mathbf{r}_{1}}, x'_{\mathbf{r}_{2}}) = x_{\mathbf{R}\mathbf{r}_{1} + \mathbf{R}\mathbf{r}_{2}} = x_{\mathbf{R}(\mathbf{r}_{1} + \mathbf{r}_{2})} = R_{3}(x_{\mathbf{r}_{1}}, x_{\mathbf{r}_{2}})',$$

$$R_{4}(x'_{\alpha}, y'_{\mathbf{r}}) = y_{\alpha \mathbf{R}\mathbf{r}} = y_{\mathbf{R}\alpha \mathbf{r}} = R_{4}(x_{\alpha}, y_{\mathbf{r}})',$$

$$R_{5}(y'_{\mathbf{r}_{1}}, y'_{\mathbf{r}_{2}}) = x_{(\mathbf{R}\mathbf{r}_{1}) \cdot (\mathbf{R}\mathbf{r}_{2})} = x_{\mathbf{r}_{1} \cdot \mathbf{r}_{2}} = R_{5}(y_{\mathbf{r}_{1}}, y_{\mathbf{r}_{2}})'.$$

This simple example illustrates a number of points relevant to physics. First of all, the MUH implies that any symmetries in the mathematical structure correspond to physical symmetries, since the relations  $R_1, R_2, \dots$  exhibit these symmetries and these relations are the *only* properties that the set elements have. An observer in a space defined as  $S_2$  above could therefore not tell the difference between this space and a rotated version of it.

Second, relations are potentially observable, because they are properties of the structure. It is therefore crucial to to define mathematical structures precisely, since seemingly subtle differences in the definition can make a crucial difference for the physics. For example, the manifold  $\mathbb{R}$ , the metric space  $\mathbb{R}$ , the vector space  $\mathbb{R}$  and the number field  $\mathbb{R}$  are all casually referred to as simply "R" or "the reals", yet they are four different structures with four very different symmetry groups. Let us illustrate this with examples related to the mathematical description of our 3-dimensional physical space, and see how such considerations can rule out many mathematical structures as candidates for corresponding to our universe.

The 3D space above contains a special point, its origin  $y_0$  defined by  $R_4(R_1(x_\alpha, x_\alpha), y_r)$  above, with no apparent counterpart in our physical space. Rather (ignoring spatial curvature for now), our physical space appears to have a further symmetry, translational symmetry, which this mathematical structure lacks. The space defined above thus has too much structure. This can be remedied by dropping  $R_3$  and  $R_4$  and replacing the 5th relation by

$$R_5(y_{\mathbf{r}_1}, y_{\mathbf{r}_2}) = x_{|\mathbf{r}_1 - \mathbf{r}_2|},\tag{7}$$

thereby making  $S_2$  a metric space rather than a vector space.

However, this still exhibits more structure than our physical space: it has a preferred length scale. Herman Weyl emphasized this point in [28]. Lengths are measured by real numbers from  $S_1$  which form a rigid structure, where the multiplicative identity  $x_1$  is special and singled out by the relation  $R_2(x_{\alpha}, x_{\alpha}) = x_1$ . In contrast, there appears to be no length scale "1" of special significance in our physical space. Because they are real numbers, two lengths in the mathematical structure can be multiplied to give another length. In contrast, we assign different units to length and area in our physical space because they cannot be directly compared. The general implication is that quantities with units are not real numbers. Only dimensionless quantities in physics may correspond to real numbers in the mathematical structure. Quantities with units may instead correspond to the 1dimensional vector space over the reals, so that only ratios between quantities are real numbers. The simplest mathematical structure corresponding to the Euclidean space of classical physics (ignoring relativity) thus involves three sets:

- $S_1$  is a set of elements  $x_{\alpha}$  labeled by real numbers
- $S_2$  is a set of elements  $y_{\alpha}$  labeled by real numbers
- $S_3$  is a set of elements  $z_{\mathbf{r}}$  labeled by 3-vectors  $\mathbf{r}$ ,
- $R_1(x_{\alpha_1}, x_{\alpha_2}) = x_{\alpha_1 \alpha_2} \in S_1$ ,
- $R_2(x_{\alpha_1}, x_{\alpha_2}) = x_{\alpha_1/\alpha_2} \in S_1$ ,
- $R_3(y_{\alpha_1}, y_{\alpha_2}) = y_{\alpha_1 + \alpha_2} \in S_2$ ,
- $R_4(x_{\alpha_1}, y_{\alpha_2}) = y_{\alpha_1 \alpha_2} \in S_2$ ,
- $R_5(z_{\mathbf{r}_1}, z_{\mathbf{r}_2}, z_{\mathbf{r}_3}) = y_{(\mathbf{r}_2 \mathbf{r}_1) \cdot (\mathbf{r}_3 \mathbf{r}_1)} \in S_2$ .

Here  $S_1$  is the rigid field of real numbers  $\mathbb{R}$ ,  $S_2$  is the 1-dimensional vector space  $\mathbb{R}$  (with no division and no preferred length scale) and  $S_3$  is a metric space (corresponding to physical space) where angles are defined but lengths are only defined up to an overall scaling. In other words, three points define an angle, and two points define a distance via the relation  $R_5(z_{\mathbf{r}_1}, z_{\mathbf{r}_2}, z_{\mathbf{r}_2}) = y_{|\mathbf{r}_2 - \mathbf{r}_1|^2} \in$  $S_2$ .

The most general automorphism of this structure corresponds to (proper or improper) rotation by a matrix **R**, translation by a vector **a** and scaling by a nonzero constant  $\lambda$ :

$$x'_{\alpha} = x_{\alpha},$$
  

$$y'_{\alpha} = y_{\lambda^{2}\alpha},$$
  

$$z'_{\mathbf{r}} = z_{\lambda \mathbf{Rr} + \mathbf{a}}.$$

For example,

$$R_5(z'_{\mathbf{r}_1}, z'_{\mathbf{r}_2}, z'_{\mathbf{r}_3}) =$$

$$= y_{[(\lambda \mathbf{R} \mathbf{r}_2 + \mathbf{a}) - (\lambda \mathbf{R} \mathbf{r}_1 + \mathbf{a})] \cdot [(\lambda \mathbf{R} \mathbf{r}_3 + \mathbf{a}) - (\lambda \mathbf{R} \mathbf{r}_1 + \mathbf{a})]}$$

$$= y_{\lambda^2(\mathbf{r}_2 - \mathbf{r}_1) \cdot (\mathbf{r}_3 - \mathbf{r}_1)} = R_5(z_{\mathbf{r}_1}, z_{\mathbf{r}_2}, z_{\mathbf{r}_3})'.$$

The success of general relativity suggests that our physical space possesses still more symmetry whereby also relations between widely separated points (like  $R_5$ )

are banished. Instead, distances are defined only between infinitesimally close points. Note, however, that neither diffeomorphism symmetry nor gauge symmetry correspond to automorphisms of the mathematical structure. In this sense, these are not physical symmetries, and correspond instead to redundant notation, *i.e.*, notation transformations relating different equivalent descriptions of the same structure. For recent reviews of these subtle issues and related controversies, see [29, 30].

If it were not for quantum physics, the mathematical structure of general relativity (a 3+1-dimensional pseudo-Riemannian manifold with various "matter" tensor fields obeying certain partial differential equations) would be a good candidate for the mathematical structure corresponding to our universe. A fully rigorous definition of the mathematical structure corresponding to the  $SU(3) \times SU(2) \times U(1)$  quantum field theory of the standard model is still considered an open problem in axiomatic field theory, even aside from the issue of quantum gravity.

# C. Orbits, subgroups and further steps

Above we argued that when studying a mathematical structure S to derive its physical phenomenology (the "inside view"), a useful first step is finding its symmetries, specifically its automorphism group  $\operatorname{Aut}(S)$ . We will now see that this in turn naturally leads to further analysis steps, such as finding orbit partitions, irreducible actions and irreducible representations.

For starters, subjecting  $\operatorname{Aut}(S)$  to the same analysis that mathematicians routinely perform when examining any group can reveal features with a physical flavor. For example, computing the subgroups of  $\operatorname{Aut}(S)$  for our last example reveals that there are subgroups of four qualitatively different types. We humans have indeed coined names ("baggage") for them: translations, rotations, scalings and parity reversal. Similarly, for a mathematical structure whose symmetries include the Poincaré group, translations, rotations, boosts, parity reversal and time reversal all emerge as separate notions in this way.

Moreover, the action of the group Aut(S) on the elements of S partitions them into equivalence classes (known in group theory as "orbits"), where the orbit of a given element is defined as the set of elements that  $\operatorname{Aut}(S)$  can transform it into. The orbits are therefore in principle observable and distinguishable from each other, whereas all elements on the same orbit are equivalent by symmetry. In the last example, any 3D point in  $S_3$  can be transformed into any other point in  $S_3$ , so all points in this space are equivalent. The scaling symmetry decomposes  $S_2$  into two orbits (0 and the rest) whereas each element in  $S_1$  is its own orbit and hence distinguishable. In the first example above, where Aut(S) is the rotation group, the three-dimensional points separate into distinct classes, since each spherical shell in  $S_2$  of fixed radius is its own orbit.

# D. Group actions and irreducible representations

Complementing this "top-down" approach of mathematically analyzing S, we can obtain further hints for useful mathematical approaches by observing our inside view of the world around us and investigating how this can be linked to the underlying mathematical structure implied by the MUH. We know empirically that our mathematical structure contains self-aware substructures ("observers") able to describe some aspects of their world mathematically, and that symmetry considerations play a major role in these mathematical descriptions. Indeed, when asked "What is a particle?", many theoretical physicists like to smugly reply "An irreducible representation of the Poincaré group". This refers to the famous insight by Wigner and others [3, 31–34] that any mathematical property that we can assign to a quantummechanical object must correspond to a ray representation of the group of spacetime symmetries. Let us briefly review this argument and generalize it to our present context.

As discussed in detail in [3, 35], the observed state of our physical world ("initial conditions") typically exhibits no symmetry at all, whereas the perceived regularities ("laws of physics") are invariant under some symmetry group G (e.g., the Poincaré symmetry for the case of relativistic quantum field theory). Suppose we can describe some aspect of this state (some properties of a localized object, say) by a vector of numbers  $\psi$ . Letting  $\psi' = \rho_{\sigma}(\psi)$  denote the description after applying a symmetry transformation  $\sigma \in G$ , the transformation rule  $\rho_{\sigma}$  must by definition have properties that we will refer to as identity, reflexivity and transitivity.

- 1. **Identity:**  $\rho_{\sigma_0}(\psi) = \psi$  for the identity transformation  $\sigma_0$  (performing no transformation should not change  $\psi$ ).
- 2. **Reflexivity:**  $\rho_{\sigma^{-1}}(\rho_{\sigma}(\psi)) = \psi$  (transforming and then un-transforming should recover  $\psi$ ).
- 3. **Transitivity:** If  $\sigma_2\sigma_1 = \sigma_3$ , then  $\rho_{\sigma_2}(\rho_{\sigma_1}(\psi)) = \rho_{\sigma_3}(\psi)$  (making two subsequent transformations should be equivalent to making the combined transformation).

In other words, the mapping from permutations  $\sigma$  to transformations  $\rho_{\sigma}$  must be a homomorphism.

Wigner and others studied the special case of quantum mechanics, where the description  $\psi$  corresponded to a complex ray, *i.e.*, to an equivalence class of complex unit vectors where any two vectors were defined as equivalent if they only differed by an overall phase. They realized that for this case, the transformation  $\rho_{\sigma}(\psi)$  must be linear and indeed unitary, which means that it satisfies the definition of being a so-called ray representation (a regular unitary group representation up to a complex phase) of the symmetry group G. Finding all such representations of the Poincaré group thus gave a catalog

of all possible transformation properties that quantum objects could have (a mass, a spin=0, 1/2, 1, ..., etc.), essentially placing an upper bound on what could exist in a Poincaré-invariant world. This cataloging effort was dramatically simplified by the fact that all representations can be decomposed into a simple list of irreducible ones, whereby degrees of freedom in  $\psi$  can be partitioned into disjoint groups that transform without mixing between the groups. This approach has proven useful not only for deepening our understanding of physics (and of how "baggage" such as mass and spin emerges from the mathematics), but also for simplifying many quantum calculations. Wigner and others have emphasized that to a large extent, "symmetries imply dynamics" in the sense that dynamics is the transformation corresponding to time translation (one of the Poincaré symmetries), and this is in turn dictated by the irreducible representation.

For our case of an arbitrary mathematical structure, we must of course drop the quantum assumptions. The identity, reflexivity and transitivity properties alone then tell us merely that  $\rho_{\sigma}$  is what mathematicians call a group action on the set of descriptions  $\psi$ . Here too, the notion of reducibility can be defined, and an interesting open question is to what extent the above-mentioned representation theory results can be be generalized. In particular, since the ray representations of quantum mechanics are more general than unitary representation and less general than group actions, one may ask whether the quantum mechanics case is in some sense the only interesting group action, or whether there are others as well. Such a group action classification could then be applied both to the exact symmetry group Aut(S) and to any effective or partial symmetry groups G, an issue to which we return below.

# E. Angles, lengths, durations and probabilities

Continuing this approach of including empirical observations as a guide, our discussion connects directly with results in the relativity and quantum literature. Using the empirical observation that we can measure consensus view quantities we call angles, distances and durations, we can connect these directly to properties of the Maxwell equations etc. in our mathematical structure. Pioneered by Einstein, this approach produced the theory of special relativity, complete with its transformation rules and the "baggage" explaining in human language how these quantities were empirically measured. The same approach has been successfully pursued in the general relativity context, where it has proven both subtle and crucial for dealing with gauge ambiguities etc. Even in minimal general relativity without electromagnetism, the above-mentioned empirical properties of space and time can be analogously derived, replacing light clocks by gravitational wave packets orbiting black holes, etc

There is also a rich body of literature pursuing the analogous approach for quantum mechanics. Starting

with the empirical fact that quantum observers perceive not schizophrenic mental superpositions but apparent randomness, the baggage corresponding to the standard rule for computing the corresponding probabilities from the Hilbert space quantities has arguably been derived (see, e.g., [36] and references therein).

# F. Approximate symmetries

Although the above analysis steps were all discussed in the context of the exact symmetries of the mathematical structure that by the MUH is our universe, they can also be applied to the approximate symmetries of mathematical structures that approximate certain aspects of this correct structure. Indeed, in the currently popular view that all we have discovered so far are effective theories (see, e.g., [37]), all physical symmetries studied to date are likely to be of this approximate status. Such effective structures can exhibit either more or less symmetry than the underlying one. For example, the distribution of air molecules around you exhibits no exact symmetry, but can be well approximated by a continuous gas in thermal equilibrium obeying a translationally and rotationally invariant wave equation. On the other hand, even if the quantum superposition of all field configurations emerging from cosmological inflation is a translationally and rotationally invariant state, any one generic element of this superposition, forming our classical "initial conditions", will lack this symmetry. We return to this issue in Section IVB.

In addition, approximate symmetries have proven useful even when the approximation is rather inaccurate. Consider, for example, a system governed by a Lagrangian, where one term exhibits a symmetry that is broken by another subdominant term. This can give rise to a natural decomposition into subsystems and an emergence of attributes thereof. For charged objects moving in an electromagnetic field, the energy-momentum 4-vectors of the objects would be separately conserved (by Noether's theorem because these terms exhibit symmetry under time and space translation) were it not for the object-field interaction terms in the Lagrangian, so we perceive them as slowly changing property of the objects themselves. In addition, the full Lagrangian has spacetime translational symmetry, so total energymomentum is strictly conserved when we include the energy-momentum of the electromagnetic field. These two facts together let us think of momentum as gradually flowing back and forth between the objects and the radiation. More generally, partial symmetries in the Lagrangian provide a natural subsystem/subsector decomposition with quantities that are conserved under some interactions but not others. Quantities that are conserved under faster interactions (say the strong interaction) can be perceived as attributes of objects (say atomic number Z) that evolve because of a slower interaction (say the weak interaction).

# IV. IMPLICATIONS FOR SYMMETRY, INITIAL CONDITIONS AND PHYSICAL CONSTANTS

Above we explored the "physics from scratch" problem, *i.e.*, possible approaches to deriving physics as we know it from an abstract baggage-free mathematical structure. This has a number of implications for foundational physics questions related to symmetry, initial conditions and physical constants.

#### A. Symmetry

The way modern physics is usually presented, symmetries are treated as an input rather than an output. For example, Einstein founded special relativity on Lorentz symmetry, *i.e.*, on the postulate that all laws of physics, including that governing the speed of light, are the same in all inertial frames. Likewise, the  $SU(3) \times SU(2) \times U(1)$  symmetry of the standard model is customarily taken as a starting assumption.

Under the MUH, the logic is reversed. The mathematical structure S of our universe has a symmetry group  $\operatorname{Aut}(S)$  that manifests itself in our perceived physical laws. The laws of physics being invariant under  $\operatorname{Aut}(S)$  (e.g., the Poincaré group) is therefore not an input but rather a logical consequence of the way the inside view arises from the outside view.

Why do symmetries play such an important role in physics? The points by Wigner and others regarding their utility for calculations and insight were reviewed above. The deeper question of why our structure S has so much symmetry is equivalent to the question of why we find ourselves on this particular structure rather than another one with less symmetry. It is arguably not surprising considering that symmetry (i.e., Aut  $(S) \neq \{\sigma_0\}$ ) appears to be more more the rule than the exception in mathematical structures. However, an anthropic selection effect may be at play as well: as pointed out by Wigner, the existence of observers able to spot regularities in the world around them probably requires symmetries [3]. For example, imagine trying to make sense of a world where the outcome of experiments depended on the spatial and temporal location of the experiment.

## B. Initial conditions

The MUH profoundly affects many notions related to initial conditions. The traditional view of these matters is eloquently summarized by e.g. [3, 35] as splitting our quantitative description of the world into two domains, "laws of physics" and "initial conditions". The former we understand and hail as the purview of physics, the latter we lack understanding for and merely take as an input to our calculations.

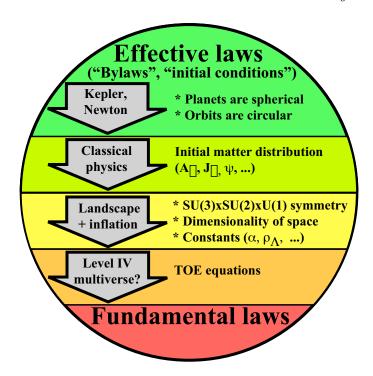


FIG. 2: The shifting boundary (horizontal lines) between fundamental laws and environmental laws/effective laws/initial conditions. Whereas Ptolemy and others had argued that the circularity of planetary orbits was a fundamental law of nature, Kepler and Newton reclassified this as an initial condition, showing that the fundamental laws also allowed highly non-circular orbits. Classical physics removed from the fundamental law category also the initial conditions for the electromagnetic field and all other forms of matter and energy (responsible for almost all the complexity we observe), leaving the fundamental laws quite simple. A TOE with a landscape and inflation reclassifies many of the remaining "laws" as initial conditions, since they can differ from one post-inflationary region to another, but since inflation generically makes each such region infinite, it can fool us into misinterpreting these environmental properties as fundamental laws. Finally, if the MUH is correct and the Level IV multiverse of all mathematical structures (see Section V) exists, then even the "theory of everything" equations that physicists are seeking are merely local bylaws in Rees' terminology[38], differing across the ensemble.

# 1. How the MUH banishes them

As illustrated in Figure 2, the borderline between these two domains has gradually shifted at the expense of initial conditions. Newton's orbital calculations focused on how our solar system evolved, not on how it came into existence, yet solar system formation in now a mainstream research area. Gradually pushing the frontier of our ignorance further back in time, scientists have studied the formation of galaxies billions of years ago, the synthesis of atomic nuclei during the first few minutes after our Big Bang and the formation of density fluctuations during an inflationary epoch many orders of magnitude earlier still. Morover, a common feature of much string theory

related model building is that there is a "landscape" of solutions, corresponding to spacetime configurations involving different dimensionality, different types of fundamental particles and different values for certain physical "constants" (see Table 1 in [39] for an up-to-date list of the 32 parameters specifying the standard models of particle physics and cosmology), some or all of which may vary across the landscape. Eternal inflation transforms such potentiality into reality, actually creating regions of space realizing each of these possibilities. However, each such region where inflation has ended is generically infinite in size, making it impossible for any inhabitants to travel to other regions where these apparent laws of physics are different.

If the MUH is correct, it completes this historical trend: The MUH leaves no room for "initial conditions", eliminating them altogether. The mathematical structure is by definition a complete description of the physical world. In contrast, a description saying that our universe just "started out" or "was created" in some unspecified state is an incomplete description, thus violating both the MUH and the ERH.

# 2. How they are a useful approximation

We humans may of course be unable to measure certain properties of our world and unable to determine which mathematical structure we inhabit. Such epistemological uncertainty is clearly compatible with the MUH, and also makes the notion of initial conditions a useful approximation even if it lacks a fundamental basis. We will therefore continue using the term initial conditions in this limited sense throughout this paper.

To deal with such uncertainty in a quantitative way, we humans have invented statistical mechanics and more general statistical techniques for quantifying statistical relations between observable quantities. These involve the notion that our initial conditions are a member of a real or hypothetical ensemble of possible initial conditions, and quantify how atypical our initial conditions are by their entropy or algorithmic complexity (see, e.g., [40, 41]).

#### 3. Cosmic complexity

There is an active literature on the complexity of our observable universe and how natural it is (see, e.g., [43–49] and references therein), tracing back to Boltzmann [50] and others. The current consensus is that the initial conditions (shortly before Big Bang nucleosynthesis, say) of this comoving volume of space (our so-called Hubble volume) were both enormously complex and yet surprisingly simple. To specify the state of its  $\sim 10^{78}$  massive particles (either classically in terms of positions and velocities, or quantum-mechanically) clearly requires a vast amount of information. Yet our universe is strik-

ingly simple in that the matter is nearly uniformly distributed on the largest scales, with density fluctuations only at the  $10^{-5}$  level. Clumpier distributions are exponentially more likely, and the maximum entropy state corresponds to the clumpiest state possible, with all the matter amassed into a giant black hole. Even on small scales, where such gravitational effects are less important, there are many regions that are very far from thermal equilibrium and heat death, e.g., the volume containing your brain. This has disturbed many authors, including Boltzmann, who pointed out that the most likely explanation of his past perceptions was that he was a disembodied brain that had temporarily assembled as a thermal fluctuation, with all his memories in place. Yet this was clearly not the case, as it made a falsifiable prediction for his future perceptions: rapid disintegration towards heat death.

The most promising resolution to this paradox that has emerged is eternal cosmological inflation [51–55]. It makes the generic post-inflationary region rather homogeneous just as observed, thereby explaining why the entropy we observe is so low. Although this has been less emphasized in the literature [43], inflation also explains why the entropy we observe is so high: even starting with a state with so low complexity that it can be defined on a single page (the Bunch-Davies vacuum of quantum field theory), decoherence produces vast numbers of for all practical purposes parallel universes that generically exhibit complexity comparable to ours [43, 56–58].

Boltzmann's paradox becomes very clear in the context of the MUH. Consider, for example, the mathematical structure of classical relativistic field theory, i.e., a number of classical fields in spatially and temporally infinite Minkowski space, with no initial conditions or other boundary conditions specified. This mathematical structure is the set of all solutions to the field equations. These different solutions are not in any way connected, so for all practical purposes, each constitutes its own parallel universe with its own "initial conditions". Even if this mathematical structure contains SAS's ("observers"), it is ruled out as a candidate for describing our world, independently of the fact that it lacks quantum mechanical and general relativity effects. The reason is that generic solutions are a high-entropy mess, so that generic observers in this structure are of the above-mentioned disembodied-brain type, i.e., totally unstable. The general unease that Boltzmann and others felt about this issue thus sharpens into a clear-cut conclusion in the MUH context: this particular mathematical structure is ruled our as a candidate for the one we inhabit.

The exact same argument can be made for the mathematical structure corresponding to classical general relativity without a matter component causing inflation. Generic states emerging from a Big-Bang like singularity are a high-entropy mess, so that almost all observers in this structure are again of the disembodied-brain type. This is most readily seen by evolving a generic state forward until a gigantic black hole is formed; the time-

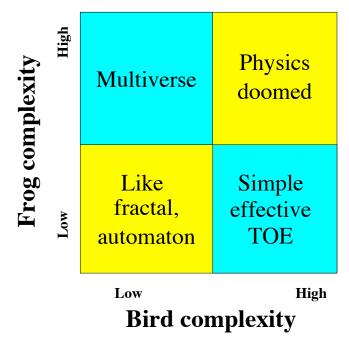


FIG. 3: The four qualitatively different possibilities regarding the cosmic complexity of the world. If a (bird's view) theory of everything can be described by fewer bits than our (frog's view) subjectively perceived universe, then we must live in a multiverse.

reversed solution is then "a messy big bang". In contrast, a mathematical structure embodying general relativity and inflation may be consistent with what we observe, since generic regions of post-inflationary space are now quite uniform.<sup>5</sup>

#### 4. How complex is our world?

Figure 3 illustrates the four qualitatively different answers to this question, depending on the complexity of a complete description of the frog's (inside) view and the bird's (outside) view.

As mentioned above, the frog complexity is, taken at face value, huge. However, there is also the logical possibility that this is a mere illusion, just as the Mandelbrot set and various patterns generated by cellular automata [18] can appear complex to the eye even though they have complete mathematical descriptions that are very simple. I personally view it as unlikely that all the observed star positions and other numbers that characterize our universe can be reduced to almost nothing by a simple data compression algorithm. Indeed, cosmological inflation explicitly predicts that the seed fluctuations are

distributed like Gaussian random variables, for which it is well-known that such compression is impossible.

The MUH does not specify whether the complexity of the mathematical structure in the bird perspective is low or high, so let us consider both possibilities. If it is extremely high, our TOE quest for this structure is clearly doomed. In particular, if describing the structure requires more bits than describing our observable universe, it is of course impossible to store the information about the structure in our universe. If it is high but our frog complexity is low, then we have no practical need for finding this true mathematical structure, since the frog description provides a simple effective TOE for all practical purposes.

A widely held hope among theoretical physicists is that the bird complexity is in fact very low, so that the TOE is simple and arguably beautiful. There is arguably no evidence yet against this simplicity hypothesis [43]. If this hypothesis is true and the bird complexity is much lower than the frog complexity, then it implies that the mathematical structure describes some form of multiverse, with the extra frog complexity entering in describing which parallel universe we are in. For example, if it is established that a complete (frog's view) description of the current state of our observable universe requires 10<sup>100</sup> bits of information, then either the (bird's view) mathematical structure requires  $\geq 10^{100}$  bits to describe, or we live in a multiverse. As is discussed in more detail in, e.g., [17, 43], an entire ensemble is often much simpler than one of its members. For instance, the algorithmic information content [40, 41] in a number is roughly speaking defined as the length (in bits) of the shortest computer program which will produce that number as output, so the information content in a generic integer n is of order  $\log_2 n$ . Nonetheless, the set of all integers  $1, 2, 3, \dots$  can be generated by quite a trivial computer program, so the algorithmic complexity of the whole set is smaller than that of a generic member. Similarly, the set of all perfect fluid solutions to the Einstein field equations has a smaller algorithmic complexity than a generic particular solution, since the former is characterized simply by giving the Einstein field equations and the latter requires the specification of vast amounts of initial data on some spacelike hypersurface. Loosely speaking, the apparent information content rises when we restrict our attention to one particular element in an ensemble, thus losing the symmetry and simplicity that was inherent in the totality of all elements taken together. The complexity of the whole ensemble is thus not only smaller than the sum of that of its parts, but it is even smaller than that of a generic one of its parts.

# C. Physical constants

Suppose the mathematical structure has a finite complexity, *i.e.*, can be defined with a finite number of bits. This follows from the Computable Universe Hypothesis

<sup>&</sup>lt;sup>5</sup> Rigorously defining "generic" in the context of eternal inflation with infinite volumes to compare is still an open problem; see, e.g., [59-63] for recent reviews.

proposed in Section VII, but also follows for any other "elegant universe" case where the TOE is simple enough to be completely described on a finite number of pages.

This supposition has strong implications for physical constants. In traditional quantum field theory, the Lagrangian contains dimensionless parameters that can in principle take any real value. Since even a single generic real number requires an infinite number of bits to specify, no computable finite-complexity mathematical structure can have such a Lagrangian. Instead, fundamental parameters must belong to the countable set of numbers that are specifiable with a finite amount of information, which includes integers, rational numbers and algebraic numbers. There are therefore only two possible origins for random-looking parameters in the standard model Lagrangian like 1/137.0360565: either they are computable from a finite amount of information, or the mathematical structure corresponds to a multiverse where the parameter takes each real number in some finitely specifiable set in some parallel universe. The apparently infinite amount of information contained in the parameter then merely reflects there being an uncountable number of parallel universes, with all this information required to specify which one we are in. The most commonly discussed situation in the string landscape context is a hybrid between these two: the parameters correspond to a discrete (finite or countably infinite) set of solutions to some equation, each set defining a stable or metastable vacuum which is for all practical purposes a parallel universe.

# Level 1: Regions beyond our cosmic horizon

Same laws of physics, different initial conditions Features: Assumptions: Infinite space, ergodic matter distribution

Evidence: - Microwave background meaurements point to flat, infinite space, large-scale smoothness

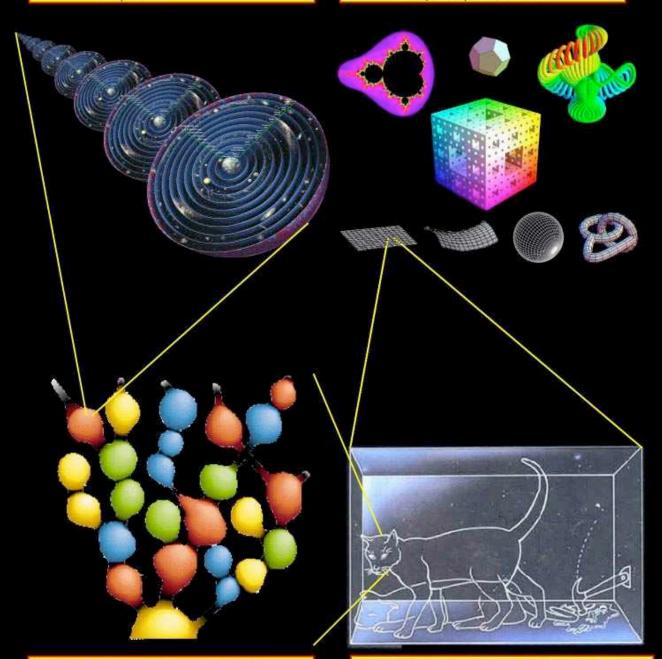
Simplest model

# Level 4: Other mathematical structures

Features: Different fundamental equations of physics Assumption: Mathematical existence = physical existence Evidence:

- Unreasonable effectiveness of math in physics

- Answers Wheeler/Hawking question: "why these equations, not others"



# Level 2: Other post-inflation bubbles

Same fundamental equations of physics, but perhaps Features:

different constants, particles and dimensionality

Assumption: Chaotic inflation occurred

Evidence: - Inflation theory explains flat space, scale-invariant

fluctuations, solves horizon problem and monopole problems and can naturally explain such bubbles

Explains fine-tuned parameters

# Level 3: The Many Worlds of Quantum Physics

Features: Same as level 2 Assumption: Physics unitary

- Experimental support for unitary physics Evidence:

- AdS/CFT correspondence suggests that even quantum gravity is unitary

- Decoherence experimentally verified

- Mathematically simplest model

# V. IMPLICATIONS FOR PARALLEL UNIVERSES

Parallel universes are now all the rage, cropping up in books, movies and even jokes: "You passed your exam in many parallel universes — but not this one." However, they are as controversial as they are popular, and it is important to ask whether they are within the purview of science, or merely silly speculation. They are also a source of confusion, since many forget to distinguish between different types of parallel universes that have been proposed, whereas [15, 16] argued that the various proposals form a natural four-level hierarchy of multiverses (Figure IV C) allowing progressively greater diversity: .

- Level I: A generic prediction of cosmological inflation is an infinite "ergodic" space, which contains Hubble volumes<sup>6</sup> realizing all initial conditions including an identical copy of you about 10<sup>10<sup>29</sup></sup> m away.
- Level II: Given the mathematical structure corresponding to the fundamental laws of physics that physicists one day hope to capture with equations on a T-shirt, different regions of space can exhibit different effective laws of physics (physical constants, dimensionality, particle content, etc.) corresponding to different local minima in a landscape of possibilities.
- Level III: In unitary quantum mechanics [25, 26], other branches of the wave function add nothing qualitatively new, which is ironic given that this level has historically been the most controversial.
- Level IV: Other mathematical structures give different fundamental equations of physics for that T-shirt.

The key question is therefore not whether there is a multiverse (since Level I is the rather uncontroversial cosmological standard model), but rather how many levels it has.

# A. Physics or philosophy?

The issue of evidence and whether this is science or philosophy has been discussed at length in the recent literature — see, e.g., [15, 16, 38, 63–74]. The key point to remember is that parallel universes are not a theory, but a prediction of certain theories. For a theory to be falsifiable, we need not be able to observe and test all its

predictions, merely at least one of them. Consider the following analogy:

| General Relativity        | Black hole interiors         |
|---------------------------|------------------------------|
| Inflation                 | Level I parallel universes   |
| Inflation + landscape     | Level II parallel universes  |
| Unitary quantum mechanics | Level III parallel universes |
| MUH                       | Level IV parallel universes  |

Because Einstein's theory of General Relativity has successfully predicted many things that we can observe, we also take seriously its predictions for things we cannot observe, e.g., that space continues inside black hole event horizons and that (contrary to early misconceptions) nothing funny happens right at the horizon. Likewise, successful predictions of the theories of cosmological inflation and unitary quantum mechanics have made some scientists take more seriously their other predictions, including various types of parallel universes.

#### B. Levels I, II and III

Level I, II and III parallel universes are all part of the same mathematical structure, but from the frog perspective, they are for all practical purposes causally disconnected. Level II, is currently a very active research area. The possibility of a string theory "landscape" [75–79], where the above-mentioned potential has perhaps 10<sup>500</sup> different minima, may offer a specific realization of the Level II multiverse which would in turn have four sublevels of increasing diversity:

- IId: different ways in which space can be compactified, which can allow both different effective dimensionality and different symmetries/elementary articles (corresponding to different topology of the curled up extra dimensions).
- IIc: different "fluxes" (generalized magnetic fields) that stabilize the extra dimensions (this sublevel is where the largest number of choices enter, perhaps  $10^{500}$ ).
- IIb: once these two choices have been made, there may be multiple minima in the effective supergravity potential.
- IIa: the same minimum and effective laws of physics can be realized in many different postinflationary bubbles, each constituting a Level I multiverse.

Level I is relevant to our discussion above in Section IV B, since the density fluctuations from cosmological inflation realize all initial conditions with a well-defined statistical distribution. Level III is relevant to the details of this generation process, since the quantum superposition of field configurations decoheres into what is for

<sup>&</sup>lt;sup>6</sup> Our *Hubble volume* is defined as the spherical region from which light has had time to reach us during the 14 billion years since our big bang. This sphere is also referred to as our *horizon volume* or simply our universe.

all practical purposes an ensemble of classical universes with different density fluctuation patterns. Just as in all cases of spontaneous symmetry breaking, the symmetry is never broken in the bird's view, merely in the frog's view: a translationally and rotationally quantum state (wave functional) such as the Bunch-Davies vacuum can decohere into an incoherent superposition of states that lack any symmetry. I suspect that we would be much less confused by Everett's Level III ideas if we were computers and familiar with the subjective aspects of routinely making and deleting copies of ourselves.

In summary, many mathematical structures contain de facto parallel universes at levels I through III, so the possibility of a multiverse is a direct and obvious implication of the MUH. We will therefore not dwell further on these levels, and devote the remainder of this section to Level IV.

#### C. Motivation for Level IV

If the TOE at the top of Figure 1 exists and is one day discovered, then an embarrassing question remains, as emphasized by John Archibald Wheeler: Why these particular equations, not others? Could there really be a fundamental, unexplained ontological asymmetry built into the very heart of reality, splitting mathematical structures into two classes, those with and without physical existence? After all, a mathematical structure is not "created" and doesn't exist "somewhere". It just exists.

As a way out of this philosophical conundrum, I have suggested [12]) that complete mathematical democracy holds: that mathematical existence and physical existence are equivalent, so that all mathematical structures have the same ontological status. This can be viewed as a form of radical Platonism, asserting that the mathematical structures in Plato's realm of ideas, the Mindscape of Rucker [6], exist "out there" in a physical sense [9], casting the so-called modal realism theory of David Lewis [80] in mathematical terms akin to what Barrow [7, 8] refers to as " $\pi$  in the sky". If this theory is correct, then since it has no free parameters, all properties of all parallel universes (including the subjective perceptions of SAS's in them) could in principle be derived by an infinitely intelligent mathematician.

In the context of the MUH, the existence of the Level IV multiverse is not optional. As was discussed in detail in Section IID, the MUH says that that a mathematical structure is our external physical reality, rather than being merely a description thereof. This equivalence between physical and mathematical existence means that if a mathematical structure contains a SAS, it will perceive itself as existing in a physically real world, just as we do (albeit generically a world with different properties from ours). Stephen Hawking famously asked "what is it that breathes fire into the equations and makes a universe for them to describe?" [81]. In the context of the MUH, there is thus no breathing required, since the point is not

that a mathematical structure describes a universe, but that it is a universe.

#### D. The "anything goes" critique

The Level IV multiverse idea described in [12] has been extensively discussed in the recent literature (see, e.g., [17, 65–68, 72, 82–99]), and has been criticized on several grounds which we will now discuss.

One common criticism asserts that it implies that all imaginable universes exist, and therefore makes no predictions at all. Variations of this have also been used as a theological argument, e.g., "All imaginable universes exist, so there's at least one with an omnipotent God who, since he's omnipotent, can insert himself into all other structures as well. Therefore God exists in our universe." Milder claims are also common, e.g., "at least some of these universes will feature miraculous events water turning into wine, etc." [72].

The MUH and the Level IV multiverse idea does certainly not imply that all imaginable universes exist. We humans can imagine many things that are mathematically undefined and hence do not correspond to mathematical structures. Mathematicians publish papers with existence proofs and demonstrating the mathematical consistency of various mathematical structures precisely because this is difficult and not possible in all cases.

A closely related misconception relates to the issue of "baggage" described in Section IIB. If a mathematical structure is objects with relations between them, then is not any theory a mathematical structure? Consider the proposition "God created Adam and Eve", where there are entities "God", "Adam" and "Eve" linked by a relation denoted "created". When we humans read this proposition, words like "God" come with baggage, i.e., additional properties and connotations not explicitly spelled out. To distill this proposition into a mathematical structure, we need to clear the names of the set elements and relations of any intrinsic meaning, so it is equivalent to saying simply that there is a set Swith three elements  $s_i$  and a relation such that  $R(s_i, s_i)$ holds if and only if i = 1 and i > 2. To us humans, this latter description has a very different feel to it, since  $s_1$ has no connotations of omnipotence, "ability to create universes", etc.

Regarding the above-mentioned water-into-wine issue [72], the known Poincaré-invariant laws of physics allow "miraculous" events to occur via thermal fluctuations or quantum tunneling, but with exponentially small probabilities that for all practical purposes preclude us from observing them. It is far from obvious that there exist other mathematical structures where such "miracles" are common while regularities remain sufficient to support the evolution of sentient observers, especially considering the fact that the cosmological measure problem [59–63] (of how to compute what is common and rare in an inflationary landscape) remains unsolved; we return

to this issue below.

# E. Other critique

A separate critique of the Level IV idea has recently been leveled by Page [71], who argues that it is "logical nonsense to talk of Level IV in the sense of the coexistence of all mathematical structures". This criticism appears to be rooted in a misconception of the notion of mathematical structure, as [71] goes on to say "Different mathematical structures can be contradictory, and contradictory ones cannot co-exist. For example, one structure could assert that spacetime exists somewhere and another that it does not exist at all. However, these two structures cannot both describe reality." Being baggage free, mathematical structures of course "assert" nothing. Different structures are, by definition, different, so one may contain Minkowski space while another does not, corresponding to two very different Level IV parallel universes. Page also postulates that "There must be one unique mathematical structure that describes ultimate reality." [71]. As we will see in the following section, this is less inconsistent with Level IV than it may sound, since many mathematical structures decompose into unrelated substructures, and separate ones can be unified.

Interesting potential problems related to Gödel incompleteness and measure have been raised by Vilenkin [74] and others, and we will devote the entire Section VII below to this fascinating topic. Here we merely note that since the measure problem has not even been solved at Level II yet [59–63], it can hardly be considered a proven show-stopper for Level IV at this point.

## F. Disconnected realities

The definition of a mathematical structure S as abstract entities with relations between them (see Appendix A for mathematical details) leads to a natural decomposition. Let us define a mathematical structure S as reducible if its entities can be split into two sets T and U with no relations relating the two. For example, there must be no relations like  $R(t_i) = u_j$  or  $R(t_i, u_j) = t_k$  for any elements  $t_i, t_k \in T$  and  $u_j \in U$ . Then T and U individually satisfy the definition of a mathematical structure. Since the relations are the only properties that the set elements have, and the elements of the structures U and T are by definition unrelated, these mathematical structures U and T are parallel Level IV universes as far as an observer in either of them is concerned.

As a trivial example, consider the mathematical structure corresponding to the set of n elements with no relations. This decomposes into n structures that are the set of one element. In contrast, most mathematical structures discussed in Appendix A (e.g., Boolean algebra, the integers, and Euclidean space) are irreducible, i.e., cannot be decomposed. The minimal mathematical struc-

ture containing the Level I, Level II and Level III multiverses is also irreducible. For example, there are mathematically defined relations between points in causally separated Hubble volumes (generated by relations between topologically neighboring points) even though they are inaccessible to observers. Similarly, there are mathematically defined relations such as the inner product between pairs of states in a quantum Hilbert space even though decoherence renders them for all practical purposes parallel Level III universes.

Given two mathematical structures, one can always define a third one that unifies them: the reducible structure consisting of the union of all elements from both, with their corresponding relations. Thus any finite number of Level IV parallel universes can be subsumed within one single mathematical structure, along the lines of Page's above-mentioned preference [71]. We will discuss subtleties related to infinite numbers of structures below in Section VII. The inside view of a given irreducible mathematical structure is thus the same regardless of whether it is defined alone or as part of a larger reducible mathematical structure. The only instance when this distinction might matter is if some sort of measure over the Level IV multiverse is involved, an issue to which we return in Section VII.

As pointed our by Linde [65], one can implement even as a single Level III multiverse the subset of the Level IV multiverse corresponding to mathematical structures that are similar to ours in being described by Lagragrangians: one simply defines a single Lagrangian which is the sum of Lagrangians in disjoint variables.

# VI. IMPLICATIONS FOR THE SIMULATION ARGUMENT

Long a staple of science fiction, the idea that our external reality is some form of computer simulation has gained prominence with recent blockbuster movies like *The Matrix*.

# A. Are we simulated?

Many scientists have argued that simulated minds are both possible and imminent (e.g., [100–103]), and, e.g., Tipler [104], Bostrom [105] and Schmidhuber [13, 17] have gone as far as discussing the probability that we are simulated (this further complicates the above-mentioned measure problem). On the other hand, McCabe has presented an argument for why a self-aware being can never be simulated by any form of digital computer [106]. This

<sup>&</sup>lt;sup>7</sup> It is noteworthy that computations in our brains are discrete to the extent that neuron firings are, and that even binary-like representations appear to be employed in some contexts. For

raises a question emphasized by Penrose [107, 108]: is it possible to build a human impersonator that passes the Turing test, yet is in no sense sentient?

Lloyd has advanced the intermediate possibility that we live in an analog simulation performed by a quantum computer, albeit not a computer designed by anybody — rather, because the structure of quantum field theory is mathematically equivalent to that of a spatially distributed quantum computer [11]. In a similar spirit, Schmidhuber [17], Wolfram [18] and others have explored the idea that the laws of physics correspond to a classical computation. Below we will explore these issues in the context of the MUH.

# B. The time misconception

Suppose that our universe is indeed some form of computation. A common misconception in the universe simulation literature is that our physical notion of a one-dimensional time must then necessarily be equated with the step-by-step one-dimensional flow of the computation. I will argue below that if the MUH is correct, then computations do not need to *evolve* the universe, but merely *describe* it (defining all its relations).

The temptation to equate time steps with computational steps is understandable, given that both form a one-dimensional sequence where (at least for the nonquantum case) the next step is determined by the current state. However, this temptation stems from an outdated classical description of physics: there is generically no natural and well-defined global time variable in general relativity, and even less so in quantum gravity where time emerges as an approximate semiclassical property of certain "clock" subsystems (e.g., [110]). Indeed, linking frog perspective time with computer time is unwarranted even within the context of classical physics. The rate of time flow perceived by an observer in the simulated universe is completely independent of the rate at which a computer runs the simulation, a point emphasized in, e.g., [12, 17, 111]. Moreover, as emphasized by Einstein, it is arguably more natural to view our universe not from the frog perspective as a 3-dimensional space where things happen, but from the bird perspective as a 4-dimensional spacetime that merely is. There should therefore be no need for the computer to compute anything at all — it could simply store all the 4-dimensional data, i.e., encode all properties of the mathematical structure that is our universe. Individual time slices could then be read out sequentially if desired, and the "simulated" world should still feel as real to its inhabitants as in the case where only 3-dimensional data is stored and evolved [12]. In

example, so-called grid cells roughly speaking record our position modulo a fixed reference length [109], so a collection of grid cell layers whose reference lengths vary by powers of two would effectively store the binary digits of our position coordinates.

conclusion, the role of the simulating computer is not to compute the history of our universe, but to specify it.

How specify it? The way in which the data are stored (the type of computer, data format, etc.) should be irrelevant, so the extent to which the inhabitants of the simulated universe perceive themselves as real should be invariant under data compression. The physical laws that we have discovered provide great means of data compression, since they make it sufficient to store the initial data at some time together with the equations and an integration routine. As emphasized in [43] and Section IV B 3 above, the initial data might be extremely simple: quantum field theory states such as the Hawking-Hartle wave function or the inflationary Bunch-Davies vacuum have very low algorithmic complexity (since they can be defined in quite brief physics papers), yet simulating their time evolution would simulate not merely one universe like ours, but a vast decohering ensemble corresponding to the above-mentioned Level III multiverse. It is therefore plausible that our universe could be simulated by quite a short computer program [12, 17, 43].

# C. A different sort of computation

The above example referred to our particular mathematical structure. More generally, as we have discussed, a complete description of an arbitrary mathematical structure S is by definition a specification of the relations between the elements of S. For finite structures, this specification can take the form of finite tableaus of numbers akin to generalized multiplication tables. More generally, they are functions whose arguments take infinitely many values and hence cannot be tabulated. For these relations to be well-defined, all these functions must be computable, i.e., there must exist a computer program that will take (some bit string encoding of) the arguments as input and, in a finite number of computational steps, output the (bit string encoding of) the function value. Each relation of the mathematical structure is thus defined by a computation. In other words, if our world is a well-defined mathematical structure in this sense, then it is indeed inexorably linked to computations, albeit computations of a different sort than those usually associated with the simulation hypothesis: these computations do not evolve the universe, but define it by evaluating its relations.

# D. The transcendent structure

Above we discussed how mathematical structures and computations are closely related, in that the former are defined by the latter. On the other hand, computations are merely special cases of mathematical structures. For example, the information content (memory state) of a digital computer is a string of bits, say "1001011100111001..." of great but finite length, equiva-

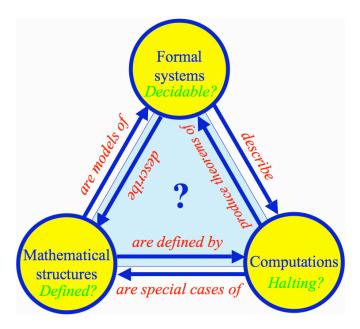


FIG. 5: The arrows indicate the close relations between mathematical structures, formal systems, and computations. The question mark suggests that these are all aspects of the same transcendent structure (the Level IV multiverse), and that we still have not fully understood its nature.

lent to some large but finite integer n written in binary. The information processing of a computer is a deterministic rule for changing each memory state into another (applied over and over again), so mathematically, it is simply a function f mapping the integers onto themselves that gets iterated:  $n \mapsto f(n) \mapsto f(f(n)) \mapsto \dots$  In other words, even the most sophisticated computer simulation is merely a special case of a mathematical structure, hence included in the Level IV multiverse.

Figure 5 illustrates how computations and mathematical structures are related not only to each other, but also to formal systems, which formally describe them. If a formal system describes a mathematical structure, the latter is said to be a model of the former [27]. Moreover, computations can generate theorems of formal systems (indeed, there are algorithms computing all theorems for the class of formal systems known as recursively enumerable). For mathematical structures, formal systems, and computations alike, there is a subset with an attractive property (being defined, decidable and halting, respectively), and in Section VII below, we will see that these three subsets are closely related.

I have drawn a question mark in the center of the triangle to suggest that the three mathematical structures, formal systems, and computations are simply different aspects of one underlying transcendent structure whose nature we still do not fully understand. This structure (perhaps restricted to the defined/decidable/halting part as hypothesized in Section VII below) exists "out there", and is both the totality of what has mathematical existence and the totality of what has physical existence,

*i.e.*, the Level IV multiverse.

## E. Does a simulation really need to be run?

A deeper understanding of the relations between mathematical structures, formal systems, and computations would shed light on many of the issues raised in this paper. One such issue is the above-mentioned measure problem, which is in essence the problem of how to deal with annoying infinities and predict conditional probabilities for what an observer should perceive given past observations.

For example, since every universe simulation corresponds to a mathematical structure, and therefore already exists in the Level IV multiverse, does it in some meaningful sense exist "more" if it is in addition run on a computer? This question is further complicated by the fact that eternal inflation predicts an infinite space with infinitely many planets, civilizations, and computers, and that the Level IV multiverse includes an infinite number of possible simulations. The above-mentioned fact that our universe (together with the entire Level III multiverse) may be simulatable by quite a short computer program (Section VIB) calls into question whether it makes any ontological difference whether simulations are "run" or not. If, as argued above, the computer need only describe and not compute the history, then the complete description would probably fit on a single memory stick, and no CPU power would be required. It would appear absurd that the existence of this memory stick would have any impact whatsoever on whether the multiverse it describes exists "for real". Even if the existence of the memory stick mattered, some elements of this multiverse will contain an identical memory stick that would "recursively" support its own physical existence. This would not involve any Catch-22 "chicken-and-egg" problem regarding whether the stick or the multiverse existed first, since the multiverse elements are 4-dimensional spacetimes, whereas "creation" is of course only a meaningful notion within a spacetime.

We return to the measure problem in Section VIIF, and issues related to the algorithmic complexity of mathematical structures, formal systems and computations.

# VII. THE COMPUTABLE UNIVERSE HYPOTHESIS

In this section, we will explore the consequences of augmenting the Mathematical Universe Hypothesis with a second assumption:

Computable Universe Hypothesis (CUH): The mathematical structure that is our external physical reality is defined by computable functions.

By this we mean that the relations (functions) that de-

fine the mathematical structure as in Appendix A 1 can all be implemented as computations that are guaranteed to halt after a finite number of steps.<sup>8</sup> We will see that the CUH places extremely restrictive conditions on mathematical structures, which has attractive advantages as well as posing serious challenges.

#### A. Relation to other hypotheses

Various related ideas have been discussed in the literature. Schmidhuber has hypothesized that all halting programs correspond to physical realities [13, 17], and related ideas have also been explored by, e.g., [7]. Note that the CUH is a different hypothesis: it requires the description (the relations) rather than the time evolution to be computable. In other words, in terms of the three vertices of Figure 5, the universe is a mathematical structure according to the MUH, as opposed to a computation according to the simulation hypothesis.

In addition, Barrow has suggested that only structures complex enough for Gödel's incompleteness theorem to apply can contain self-aware observers [8]. Below we will see that the CUH in a sense postulates the exact opposite.

# B. Mathematical structures, formal systems, and computations

Before exploring the implications of the CUH, let us discuss the motivation for it.

I have long wondered whether Gödel's incompleteness theorem in some sense torpedoes the MUH, and concerns along these lines have also been raised by Vilenkin [74] and others. Indeed, this worry is somewhat broader, extending to all three vertices of Figure 5 above. This figure illustrates that mathematical structures, formal systems, and computations are closely related, suggesting that they are all aspects of the same transcendent structure (the Level IV multiverse), whose nature we have still not fully understood. The figure also illustrates that there are potential problems at all three vertices of the triangle: mathematical structures may have relations that

are undefined, formal systems may contain undecidable statements, and computations may not halt after a finite number of steps. Let us now revisit the relation between these three issues in more detail than we did above in Section VI.

The relations between the three vertices with their corresponding complications are illustrated by six arrows. Since different arrows are studied by different specialists in a range of fields from mathematical logic to computer science, the study of the triangle as a whole is somewhat interdisciplinary. The connection between formal systems and mathematical structures is the subject of the branch of mathematics known as model theory (see, e.g., [27]). The use of computations to automatically prove theorems of formal systems is actively studied by computer scientists, and arbitrary computations are in turn special cases of mathematical structures that are described by formal systems. Finally, as we have discussed, mathematical structures can be explicitly defined by computations that implement their relations. Further discussion of the relation between mathematical structures and computations can be found in, e.g., [12, 16, 112].

Note that the correspondence between the three vertices is not one-to-one. There are often many mathematical structures that are described by ("are models of") a given formal system; for example, all specific groups are models of the formal system containing only the group axioms. Conversely, several formal systems may be equivalent descriptions of the same mathematical structure — e.q. [12] gives examples of this. Only a subset of all mathematical structures can be interpreted as computations, simple examples including our world [11] (since it allows computers to be built within it) and certain integer mappings (which can be interpreted as defining a Universal Turing Machine or other digital computer [113]). Finally, many different sets of computations can define the same mathematical structure as detailed in Appendix A1, by implementing equivalent choices of generating relations and/or by corresponding to different labelings of the set elements.

#### C. Undefined, undecidable and uncomputable

Bearing these correspondences in mind, let us now discuss the Gödel-inspired worry mentioned above: that the MUH makes no sense because our universe would be somehow inconsistent or undefined. If one accepts David Hilbert's dictum that "mathematical existence is merely freedom from contradiction" [114], then an inconsistent structure would not exist mathematically, let alone physically as in the MUH.

Our standard model of physics includes everyday mathematical structures such as the integers (defined by the Peano axioms) and real numbers. Yet Gödel's second incompleteness theorem [115] implies that we can never be 100% sure that this everyday mathematics is consis-

<sup>&</sup>lt;sup>8</sup> This is not to be confused with another common usage of the term "computable function", as functions that can be approximated to any desired accuracy in a finite number of steps (as opposed to computed exactly as in our definition). To distinguish these two usages, we can refer to our definition as an "exactly computable function" and to the alternative usage as an "approximately computable function". Exact computability implies approximate computability, but the converse is not true. For example, if a real-valued function f with no arguments (a constant) is approximately computable and we keep computing it to be consistent with zero to ever greater accuracy, we still do not know whether f < 0, f = 0 or f > 0. As described below, functions of a real variable are never exactly computable, and there are interesting complications even for functions of integers.

tent: it leaves open the possibility that a finite length proof exists within number theory itself demonstrating that 0 = 1. Using this result, every other well-defined statement in the formal system could in turn be proven to be true and mathematics as we know it would collapse like a house of cards [115].

Gödel's theorems refer to the top vertex in Figure 5, i.e., formal systems, and we must understand how this relates to lower left (the mathematical structures of the MUH) and the lower right (the computations that define the structures). Consider the example of number theory with predicate calculus, where Gödel's first incompleteness theorem shows that there are undecidable statements which can neither be proved nor refuted. Following the notation of Appendix A, the corresponding mathematical structure involves two sets:

- 1. The two-element (Boolean) set  $S_1 \equiv \{0,1\}$  which we can interpret as  $\{False, True\}$  and
- 2. the countably infinite set  $S_2 \equiv \mathbb{Z}$  which we can interpret as the integers.

Standard logical operations such as  $\sim$  ("not") and & ("and") are Boolean-valued functions of Boolean variables (for example, & maps  $S_1 \times S_1 \mapsto S_1$ ). Operations such as + and  $\cdot$  map integers into integers (+ maps  $S_2 \times S_2 \mapsto S_2$ ). So-called predicates are functions mapping into Booleans that can mix the two sets by also taking integers as arguments. A simple example is < ("less than"), mapping  $S_2 \times S_2 \mapsto S_1$ . In number theory, the quantifiers  $\forall$  and  $\exists$  allow the construction of more interesting functions, such as the predicate P mapping  $S_2 \mapsto S_1$  which is true if its argument is prime:

$$P(n) \equiv (\forall a)(\forall b)[[a > 1] \& [b > 1] \Rightarrow a \cdot b \neq n]. \tag{8}$$

This function P(n) is undeniably well-defined in the sense that it is computable: there exists a simple computer program that takes an arbitrary integer n (represented as a bit string) as input, computes the single bit representing P(n) in a finite number of steps, and then halts. However, for the predicate T(n) defined by

$$T(n) \equiv (\exists a)[(a > n)\&P(a)\&P(a + 2)],$$
 (9)

no such halting algorithm for its computation has yet been discovered, since it corresponds to the statement that there are twin primes larger than n. One can write a simple computer program that loops and tests  $a = n+1, n+2, \ldots$  and halts returning 1 if it finds a and a+2 to be prime, and this program is guaranteed to correctly evaluate T(n) as long as  $n < 2003663613 \times 2^{195000} - 1$ , corresponding to the record twin prime as of writing. However, since the existence of infinitely many twin primes is a famous open question, the program might not halt for all n, and no halting algorithm for evaluating T(n) is currently known. Equivalently, there is no known halting algorithm for evaluating the Boolean constant (function with no arguments)

$$T \equiv (\forall n)(\exists a)[(a > n)\&P(a)\&P(a + 2)],$$
 (10)

which equals 1 if there are infinitely many twin primes, zero otherwise.

It may turn out that a halting algorithm for computing T exists, and that we humans simply have not discovered it yet. In contrast, statements in the formal system that are undecidable statements in Gödel's first incompleteness theorem correspond to, in this mathematical structure, predicates similar to that of equation (10) that cannot be computed by any halting algorithm, and are thus undefined in a computational sense. Despite this, these Boolean functions are similar to equation (10) in being mere statements about integers; the twist is that the quantifiers are used in an insidious way that can be interpreted as self-referencing, so that any halting computation of the function would lead to a contradiction.

This is intimately linked to the famous halting problem in computer science [116, 117]. The proofs by Church and Turing that no halting algorithm can determine whether an arbitrary program will halt uses an analogous self-reference and quantification over all programs to reach its conclusion. Indeed, a slightly weaker form of Gödel's first incompleteness theorem is an easy consequence of the undecidability of the halting problem.

The results of Gödel, Church and Turing thus show that under certain circumstances, there are questions that can be posed but not answered<sup>9</sup>. We have seen that for a mathematical structure, this corresponds to relations that are unsatisfactorily defined in the sense that they cannot be implemented by computations that are guaranteed to halt.

#### D. Levels of mathematical relatity

So how well-defined do mathematical structures need to be to be real, *i.e.*, members of the Level IV multiverse? There is a range of interesting possibilities for what structures qualify:

- 1. No structures (i.e., the MUH is false).
- 2. Finite structures. These are trivially computable, since all their relations can be defined by finite look-up tables.

<sup>&</sup>lt;sup>9</sup> Note that what is striking about Gödel's first incompleteness theorem is not the existence of undecidable statements per se. For example, if one takes a simple decidable formal system such as Boolean algebra or Euclidean geometry and drops one of the axioms, there will be statements that can neither be proved nor refuted. A first remarkable aspect of the theorem is that even statements within the heart of standard mathematics (number theory) are undecidable. A second impressive fact is that one cannot merely blame weak axioms and inference rules for the failure, since the incompleteness theorem applies to any sufficiently powerful formal system. In other words, adding more firepower does not help: if you add more tools to allow you to answer the undecidable questions, these same tools allow you to pose new questions that you cannot answer.

- Computable structures (whose relations are defined by halting computations).
- 4. Structures with relations defined by computations that are not guaranteed to halt (*i.e.*, may require infinitely many steps), like the example of equation (9). Based on a Gödel-undecidable statement, one can even define a function which is guaranteed to be uncomputable, yet would be computable if infinitely many computational steps were allowed.
- 5. Still more general structures. For example, mathematical structures with uncountably many set elements (like the continuous space examples in Section III B and virtually all current models of physics) are all uncomputable: one cannot even input the function arguments into the computation, since even a single generic real number requires infinitely many bits to describe.

The CUH postulates that (3) is the limit. If the CUH is false, then an even more conservative hypothesis is the Computable Finite Universe Hypothesis (CFUH) that (2) is the limit.

It is interesting to note that closely related issues have been hotly debated among mathematicians without any reference to physics (see [118, 119] for recent updates). According to the finitist school of mathematicians (which included Kronecker, Weyl and Goodstein [120]), representing an extreme form of so-called intuitionism and constructivism, a mathematical object does not exist unless it can be constructed from natural numbers in a finite number of steps. This leads directly to (3).

# E. Conceptual implications of the CUH

According to the CUH, the mathematical structure that is our universe is computable and hence well-defined in the strong sense that all its relations can be computed. There are thus no physical aspects of our universe that are uncomputable/undecidable, eliminating the abovementioned concern that Gödel's work makes it somehow incomplete or inconsistent. In contrast, it remains unclear to what extent the above-mentioned alternatives (4) and (5) can be defined in a rigorous and self-consistent way.

By drastically limiting the number of mathematical structures to be considered, the CUH also removes potential paradoxes related to the Level IV multiverse. A computable mathematical structure can by definition be specified by a finite number of bits. For example, each of the finitely many generating relations can be specified as a finite number of characters in some programming language supporting arbitrarily large integers (along the lines of the Mathematica, Maple and Matlab packages). Since each finite bit string can be interpreted as an integer in binary, there are thus only countably many computable mathematical structures. The full Level IV multiverse (the union of all these countably infinitely many

computable mathematical structures) is then *not* itself a computable mathematical structure, since it has infinitely many generating relations. The Level IV multiverse is therefore not a member of itself, precluding Russell-style paradoxes, which addresses a concern raised in [22, 71].

## F. Physics implications of the CUH

Many authors have puzzled over why our physical laws appear relatively simple. For example, we could imagine replacing the standard model gauge group  $SU(3) \times$  $SU(2)\times U(1)$  by a much more complicated Lie group, and more generally reducing the the symmetries of nature such that way more than 32 dimensionless parameters [39] were required to describe the laws. It is tempting to speculate that the CUH contributes to this relative simplicity by sharply limiting the complexity of the Level IV multiverse. By banishing the continuum altogether, perhaps the CUH may also help downsize the inflationary landscape [75–79], and resolve the cosmological measure problem, which is in large part linked to the ability of a true continuum to exponential stretching forever and producing infinite numbers of observers [59–63]. If is unclear whether some sort of measure over the Level IV multiverse is required to fully resolve the measure problem, but if this is the case and the CUH is correct, then the measure could depend on the algorithmic complexity of the mathematical structures, which would be finite. Labeling them all by finite bit strings s interpreted as real numbers on the unit interval [0,1) (with the bits giving the binary decimals), the most obvious measure for a given structure S would be the fraction of the unit interval covered by real numbers whose bit bit strings begin with strings s defining S. A string of length nbit thus gets weight  $2^{-n}$ , which means that the measure rewards simpler structures. The analogous measure for computer programs is advocated in [17]. A major concern about such measures is of course that they depend on the choice of representation of structures or computations as bit strings, and no obvious candidate currently exists for which representation to use.

As long as the number of bits required to describe our (bird's view) mathematical structure is smaller than required to describe our (frog's view) observed universe, the mathematical structure must contain parallel universes as discussed in Section IV B 4. In particular, if the frog's view description involves any real numbers, parallel universes are guaranteed, since their description requires infinitely many bits while CUH guarantees that the mathematical structure can be described by finitely many bits.

Penrose has suggested that the laws of physics must involve mathematics triggering Gödel's incompleteness theorems because we humans are able to prove theorems regarding undecidable statements *etc.* However, the fact that we can talk about the uncomputable clearly does not

violate the consistency of our universe being computable (this point is also emphasized in [17]).

Barrow has suggested that if our universe is a computer program, then all the laws of physics must involve approximately computable functions [7]. As emphasized by [106], this would only be required if the computer is computing the time-evolution. It would not necessarily be required if the computer merely stores the 4-dimensional history or defines it in some other way, say by computationally implementing all relations.

# G. Challenges for the CUH

Above we focused on attractive features of the CUH such as ensuring that the Level IV multiverse is rigorously defined and perhaps mitigating the cosmological measure problem by limiting what exists. However, the CUH also poses serious challenges that need to be resolved.

A first challenge involves our definition of a mathematical structure as an equivalence class of descriptions. Since the problem of establishing whether two halting computations define the same function may be uncomputable, we lack a general algorithm for establishing whether two descriptions belong to the same equivalence class. If this matters in any observable way, it would presumably be via the measure problem, in case it makes a difference whether two equivalent descriptions are counted separately or only once. The more conservative CFUH mentioned in Section VII D is free from this ambiguity, since a simple halting algorithm can determine whether any two finite mathematical structures are equivalent.

A more immediate challenge is that virtually all historically successful theories of physics violate the CUH, and that it is far from obvious whether a viable computable alternative exists. The main source of CUH violation comes from incorporating the continuum, usually in the form of real or complex numbers, which cannot even comprise the input to a finite computation since they generically require infinitely many bits to specify. Even approaches attempting to banish the classical spacetime continuum by discretizing or quantizing it tend to maintain continuous variables in other aspects of the theory such as field strengths or wave function amplitudes. Let us briefly discuss two different approaches to this continuum challenge:

- Replacing real numbers by a countable and computable pseudo-continuum such as algebraic numbers.
- 2. Abandoning the continuum altogether, deriving the apparent physical continuum as an effective theory in some appropriate limit.

In the first approach, algebraic numbers and algebraic

functions<sup>10</sup> are perhaps the best contenders. There are only countably many of them, all defined by polynomials with integer coefficients. An algebraic number x is defined by a univariate polynomial P through P(x) = 0, a univariate algebraic function y(x) is defined by a bivariate polynomial through P(x,y) = 0, a bivariate algebraic function z(x, y) is defined by a trivariate polynomial through P(x, y, z) = 0, and so on. Algebraic functions have some very attractive features. They are closed under addition, multiplication, composition, differentiation, and even equation solving. Moreover, all of these operations on algebraic functions, as well as Boolean-valued functions like = and <, can be implemented by halting computations, making them a computable mathematical structure. In contrast, rational numbers and functions are not closed under equation solving  $(x^2 = 2 \text{ having})$ no rational solution). In the broader class of approximately computable functions, which includes algebraic functions,  $\pi$ ,  $\sin x$  and virtually all other constants and functions taught in introductory mathematics courses, the Boolean-valued functions = and < cannot be implemented by computations that are guaranteed to halt. Algebraic functions are, however, not closed under integration, which wreaks havoc with attempts to solve the differential equations of classical physics. It is also unclear how to formulate gauge invariance without the exponential function.

In the second approach, one abandons the continuum as fundamental and tries to recover it as an approximation. We have never measured anything in physics to more than about 15 significant digits, and no experiment has been carried out whose outcome depends on the hypothesis that a true continuum exists, or hinges on Nature performing a non-halting computation. It is striking that many of the continuum models of classical mathematical physics (like the wave equation, diffusion equation and Navier-Stokes equation for various media) are known to be mere approximations of an underlying discrete collection of atoms. Quantum gravity research suggests that even classical spacetime breaks down on very small scales. We therefore cannot be sure that quantities that we still treat as continuous (like the metric, field strengths, and quantum amplitudes) are not mere approximations of something discrete. Indeed, difference equations, lattice models and other discrete computable structures can approximate our continuum physics models so well that we use them for numerical computations. leaving open the questions of whether the mathematical structure of our universe is more like the former or more like the latter. Some authors have gone as far as suggesting that the mathematical structure is both computable and finite like a cellular automaton [17, 18]. Adding fur-

<sup>&</sup>lt;sup>10</sup> Here we use the phrase "algebraic numbers" as shorthand for the special case of algebraic numbers over the field of rational numbers.

ther twists, physics has also produced examples of how something continuous (like quantum fields) can produce a discrete solution (like a crystal lattice) which in turn appears like a continuous medium on large scales, which in turns has effective discrete particles (say phonons). Such effective particles may even behave like ones in our standard model [122, 123], raising the possibility that we may have multiple layers of effective continuous and discrete descriptions on top of what is ultimately a discrete computable structure.

#### VIII. CONCLUSIONS

This paper has explored the implications of the Mathematical Universe Hypothesis (MUH) that our external physical reality is a mathematical structure (a set of abstract entities with relations between them). I have argued that the MUH follows from the external reality hypothesis (ERH) that there exists an external physical reality completely independently of us humans, and that it constitutes the opposite extreme of the Copenhagen interpretation and other "many words interpretations" of physics where human-related notions like observation are fundamental.

#### A. Main results

In Section III, we discussed the challenge of deriving our perceived everyday view (the "frog's view") of our world from the formal description (the "bird's view") of the mathematical structure, and argued that although much work remains to be done here, promising first steps include computing the automorphism group and its subgroups, orbits and irreducible actions. We discussed how the importance of physical symmetries and irreducible representations emerges naturally, since any symmetries in the mathematical structure correspond to physical symmetries, and relations are potentially observable. The laws of physics being invariant under a particular symmetry group (as per Einstein's two postulates of special relativity, say) is therefore not an input but rather a logical consequence of the MUH. We found it important to define mathematical structures precisely, and concluded that only dimensionless quantities (not ones with units) can be real numbers.

In Section IV, we saw that since the MUH leaves no room for arbitrariness or fundamental randomness, it raises the bar for what constitutes an acceptable theory, banishing the traditional notion of unspecified initial conditions. This makes it challenging to avoid some form of multiverse. Our frog's view of the world appears to require a vast amount of information (perhaps  $10^{100}$  bits) to describe. If this is correct, then any complete theory of everything expressible with fewer bits bits must describe a multiverse. As discussed in Section V, to describe the Level I multiverse of Hubble volumes emerging from in-

flation with all semiclasical initial conditions may require only of order 10<sup>3</sup> bits (to specify the 32 dimensionless parameters tabulated in [39] as well as some mathematical details like the  $SU(3) \times SU(2) \times U(1)$  symmetry group - the rest of those Googol bits merely specify which particular Hubble volume we reside in. To describe the larger Level II multiverse may require even less information (say 10<sup>2</sup> bits to specify that our mathematical structure is string theory rather than something else). Finally, the ultimate ensemble of the Level IV multiverse would require 0 bits to specify, since it has no free parameters. Thus the algorithmic complexity (information content) of a multiverse is not only smaller than for the sum of its parts, but even smaller than for a generic one of its parts. Thus in the context of the Level I multiverse, eternal inflation explains not only why the observed entropy of our universe is so low, but also why it is so high.

Staying on the multiverse topic, we defined and extensively discussed the Level IV multiverse of mathematical structures. We argued that the existence of this Level IV multiverse (and therefore also Levels I, II and III as long as inflation and quantum mechanics are mathematically consistent) is a direct consequence of the MUH.

In Section VI, we revisited the widely discussed idea that our universe is some sort of computer simulation. We argued that, in the MUH context, it is unjustified to identify the 1-dimensional computational sequence with our 1-dimensional time, because the computation needs to describe rather than evolve the universe. There is therefore no need for such computations to be run.

In Section VII, we explored how mathematical structures, formal systems, and computations are closely related, suggesting that they are all aspects of the same transcendent structure (the Level IV multiverse) whose nature we have still not fully understood. We explored an additional assumption: the Computable Universe Hypothesis (CUH) that the mathematical structure that is our external physical reality is defined by computable functions. We argued that this assumption may be needed tor the MUH to make sense, as Gödel incompleteness and Church-Turing uncomputability will otherwise correspond to unsatisfactorily defined relations in the mathematical structure that require infinitely many computational steps to evaluate. We discussed how, although the CUH brings severe challenges for future exploration, it may help with the cosmological measure problem

# B. Outlook

If the MUH is correct, if offers a fresh perspective on many hotly debated issues at the foundations of physics, mathematics and computer science. It motivates further interdisciplinary research on the relations illustrated in Figure 5. This includes searching for a computable mathematical structure that can adequately approximate our current standard model of physics, dispensing with the continuum.

Is the MUH correct, making such efforts worthwhile? One of its key predictions is that physics research will uncover mathematical regularities in nature. As mentioned above, the score card has been amazing in this regard, ever since the basic idea of a mathematical universe was first articulated by the Pythagoreans, prompting awestruck endorsements of the idea from Galileo, Dirac[2], Wigner [3] and others even before the standard models of particle physics and cosmology emerged. I know of no other compelling explanation for this trend other than that the physical world really is mathematical.

It is arguably worthwhile to study implications of the MUH even if one subscribes to an alternative viewpoint, as it forms a logical extreme in a broad spectrum of philosophical interpretations of physics. It is arguably extreme in the sense of being maximally offensive to human vanity. Since our earliest ancestors admired the stars, our human egos have suffered a series of blows. For starters, we are smaller than we thought. Eratosthenes showed that Earth was larger than millions of humans, and his Hellenic compatriots realized that the solar system was thousands of times larger still. Yet for all its grandeur, our Sun turned out to be merely one rather ordinary star among hundreds of billions in a galaxy that in turn is merely one of billions in our observable universe, the spherical region from which light has had time to reach us during the 14 billion years since our big bang. Then there are more (perhaps infinitely many) such regions. Our lives are small temporally as well as spatially: if this 14 billion year cosmic history were scaled to one year. then 100,000 years of human history would be 4 minutes and a 100 year life would be 0.2 seconds. Further deflating our hubris, we have learned that we are not that special either. Darwin taught us that we are animals, Freud taught us that we are irrational, machines now outpower us, and just last year, Deep Fritz outsmarted our Chess champion Vladimir Kramnik. Adding insult to injury, cosmologists have found that we are not even made out of the majority substance. The MUH brings this human demotion to its logical extreme: not only is the Level IV Multiverse larger still, but even the languages, the notions and the common cultural heritage that we have evolved is dismissed as "baggage", stripped of any fundamental status for describing the ultimate reality.

The most compelling argument against the MUH hinges on such emotional issues: it arguably feels counterintuitive and disturbing. On the other hand, placing humility over vanity has proven a more fruitful approach to physics, as emphasized by Copernicus, Galileo and Darwin. Moreover, if the MUH is true, then it constitutes great news for science, allowing the possibility that an elegant unification of physics, mathematics and computer science will one day allow us humans to understand our reality even more deeply than many dreamed would be possible.

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# APPENDIX A: WHAT IS A MATHEMATICAL STRUCTURE?

This Appendix gives a discussion of mathematical structures at a more technical level, written primarily with physicists and mathematicians in mind. The mathematics described here falls within the subject known as model theory. For an introductory textbook on the subject that is reasonable accessible to physicists, see [27].

There are two common ways of introducing mathematical structures: as relations between abstract entities (as in Section II) or via formal systems (as in, e.g., [12]). The two are intimately linked: in model theory terminology, the former is said to be a model of the latter. Although I emphasized the latter in [12], I have centered the discussion in this paper around the former, both for pedagogical reasons and because it is more closely linked to our discussion of issues such as symmetry and computability.

This Appendix is organized as follows. After a definition of the concept of a mathematical structure, this is illustrated with examples of a few simple finite ones. We then give examples of infinite ones, and discuss various subtleties related to units, observability, Gödelincompleteness and Church-Turing incomputability.

# 1. Mathematical structures

We define a mathematical structure as a set S of abstract entities and relations  $R_1$ ,  $R_2$ , ... between them<sup>11</sup>.

<sup>&</sup>lt;sup>11</sup> Throughout this paper, I have tried to conform to the standard mathematical terminology as closely as possible without obscuring physical intuition. Unless explicitly specified, the usage is standard. The mathematical structure definition given here differs from the common one of e.g. [27] in two ways:

<sup>1.</sup> It allows multiple types (corresponding to the different sets  $S_i$ ), much like different data types (boolean, integer, real, etc.) in a programming language, because this greatly simplifies the definition of more complex structures cropping up in physics.

<sup>2.</sup> It defines a mathematical structure by all its relations. This

Specifically, let us define the entities and relations of a mathematical structure as follows:

Given a finite number of sets  $S_1, S_2, ..., S_n$ ,

- 1. the set of entities is the union  $S = S_1 \cup S_2 \cup ... \cup S_n$ ,
- 2. the relations are functions on these sets, specifically mappings from some number of sets to a set:  $S_{i_1} \times S_{i_2} \times ... \times S_{i_k} \mapsto S_j$ .

For a Boolean-valued function R, (a function whose range  $S_j = \{0,1\}$ ) we say that "the relation R holds" for those variables where R=1. Functions that are not Boolean-valued can readily be interpreted as relations as well — for instance, we say that the relation R(a,b) = c holds if the function R maps (a,b) to c.<sup>12</sup> A mathematical structure typically has a countably infinite number of relations. It is defined by

- 1. specifying the entities,
- 2. specifying a finite set of relations ("generating relations"), and
- 3. the rule that composition of any two relations generates a new relation.

This means that there are typically infinitely many equivalent ways of defining a given mathematical structure, the most convenient one often being the shortest. We say that one mathematical structure definition generates another if its generating relations generate all generating relations of the other, so two structure definitions are equivalent if they generate each other. There is a simple halting algorithm for determining whether any two finite mathematical structure definitions are equivalent.

# 2. Mathematical structures examples

Let us clarify all of this with a few examples, starting with *finite* mathematical structures (ones where there are only a finite number of sets  $S_i$  with a finite number of elements).

means that one only needs to specify generators, a finite set of relations that generate all others.

## a. Example: Boolean algebra

This example corresponds to the case of a single set with only two elements, with the generating relations indicated by the following tableaus:

$$S = \begin{bmatrix} 0 \\ 1 \end{bmatrix}, \quad R_1 = \begin{bmatrix} 0 \\ 0 \end{bmatrix}, \quad R_2 = \begin{bmatrix} 1 \\ 0 \end{bmatrix}, \quad R_3 = \begin{bmatrix} 1 \\ 0 \end{bmatrix}, \quad R_4 = \begin{bmatrix} 0 & 0 \\ 0 & 1 \end{bmatrix},$$
$$R_5 = \begin{bmatrix} 0 & 1 \\ 1 & 1 \end{bmatrix}, \quad R_6 = \begin{bmatrix} 1 & 1 \\ 0 & 1 \end{bmatrix}, \quad R_7 = \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix}, \quad R_8 = \begin{bmatrix} 1 & 1 \\ 1 & 0 \end{bmatrix}. \quad (A1)$$

The  $2 \times 2$  boxes specify the values of functions with two arguments analogously to the multiplication table of equation (4), and the smaller boxes analogously define functions taking zero or one arguments. These eight relations are normally denoted by the symbols  $F, T, \sim, \&, \bigvee, \Rightarrow, \Leftrightarrow$  and |, respectively, and referred to as "false", "true", "not", "and", "or", "implies", "is equivalent to (xor)" and "nand".

As an illustration of the idea of equivalent definitions, note that

$$S = \begin{bmatrix} 0 \\ 1 \end{bmatrix}, \quad R = \begin{bmatrix} 1 & 1 \\ 1 & 0 \end{bmatrix} \tag{A2}$$

defines the *same* mathematical structure as equation (A1). This is because the single relation R ("nand", also known as Sheffer symbol |) generates all the relations of equation (A2):

$$\begin{array}{rcl} R_1 &=& R(R(X,R(X,X)),R(X,R(X,X))), \\ R_2 &=& R(X,R(X,X)), \\ R_3(X) &=& R(X,X), \\ R_4(X,Y) &=& R(R(X,Y),R(X,Y)), \\ R_5(X,Y) &=& R(R(X,X),R(Y,Y)), \\ R_6(X,Y) &=& R(X,R(Y,Y)), \\ R_7(X,Y) &=& R(R(X,Y),R(R(X,X),R(Y,Y))), \\ R_8(X,Y) &=& R(X,Y), \end{array}$$

or, in more familiar notation,

$$F = (X|(X|X))|(X|(X|X)),$$

$$T = X|(X|X),$$

$$\sim X = X|X,$$

$$X \& Y = (X|Y)|(X|Y),$$

$$X \bigvee Y = (X|X)|(Y|Y),$$

$$X \Rightarrow Y = X|(Y|Y),$$

$$X \Leftrightarrow Y = (X|Y)|((X|X)|(Y|Y)),$$

$$X|Y = X|Y.$$

(Note that the parentheses are needed since, whereas &,  $\bigvee$  and  $\Leftrightarrow$  are associative, | is not.) Not or ("nor") generates the same mathematical structure as "nand". Another popular choice of generators for Boolean algebra,

The reader preferring to start without assuming the definition of a function can begin with Zermelo-Fraenkel set theory alone and define relations as subsets of product sets of the type  $S_{i_1} \times S_{i_2} \times \ldots \times S_{i_k}$ . Subsets are equivalent to Boolean functions: one says that the relation  $R(a_1, a_2, ..., a_n)$  holds (and that the Boolean function  $R(a_1, a_2, ..., a_n)$  is true) if  $(a_1, a_2, ..., a_n) \in R$ , false otherwise. Non-Boolean functions are definable by interpreting a relation R as an  $S_{i_k}$ -valued function and writing  $R(a_1, a_2, ..., a_{n-1}) = a_n$  if for any values of the first n-1 variables, there is one and only one value  $a_n$  of the last variable such that the relation  $R(a_1, a_2, ..., a_n)$  is true.

employed by Gödel, is using only  $R_3$  and  $R_5$  ( $\sim$  and  $\vee$ ) from equation (A1).

Not only the relations of equation (A1), but *all* possible Boolean functions of arbitrarily many (not just zero, one or two) variables can be expressed in terms of the Sheffer relation | alone. This means that the mathematical structure of Boolean algebra is simply all Boolean functions.

This simple example also illustrates why we humans create "baggage", symbols and words with implied meaning, like "or". Of all of the infinitely many equivalent definitions of Boolean algebra, Equation (A2) is clearly the most economical, with only a single generating relation. Why then is it so common to define symbols and names for more? Because this provides convenient shorthand and intuition when working with Boolean algebra in practice. Note that we humans have come up with familiar names for all nonary, unary and binary relations: There are  $2^{2^0} = 2$  nonary ones (F & T),  $2^{2^1} = 4$  unary ones (F, T, the identity relation and  $\sim$ , the last one being the only one deserving a new symbol) and  $2^{2^2} = 16$  binary ones  $(F, T, X, \sim X, Y, \sim Y, X\&Y, \sim (X\&Y), X\bigvee Y, \sim (X\bigvee Y), X\Leftrightarrow Y, \sim (X\Leftrightarrow Y), X\Rightarrow Y, \sim (X\Rightarrow Y), Y\Rightarrow X, \sim (Y\Rightarrow X).$ 

# b. Example: the group $C_3$

As another very simple example of a finite mathematical structure, consider the 3-element group defined by

$$S = \begin{bmatrix} 0 \\ 1 \\ 2 \end{bmatrix}, \quad R_1 = \begin{bmatrix} 0 \\ 0 \\ 1 \end{bmatrix}, \quad R_2 = \begin{bmatrix} 0 & 1 & 2 \\ 2 & 1 & 2 & 0 \\ 2 & 0 & 1 \end{bmatrix}. \quad (A3)$$

The usual notation for these relations is  $R_1 = e$ ,  $R_2(g) = g^{-1}$ ,  $R_3(g_1, g_2) = g_1g_2$ . In the above-mentioned Boolean algebra example, there were many equivalent choices of generators. The situation is similar for groups, which can be defined with a single generating relation  $R(a, b) = ab^{-1}$ , in terms of which the three relations above can all be reexpressed:

$$R_1 = R(a, a) = e,$$
  
 $R_2(a) = R(R(a, a), a) = a^{-1},$   
 $R_3(a, b) = R(a, R(R(b, b), b)) = ab.$  (A4)

The specific example of equation (A3) thus has the following simpler equivalent definition:

$$S = \begin{bmatrix} 0 \\ 1 \\ 2 \end{bmatrix}, \quad R = \begin{bmatrix} 0 & 2 & 1 \\ 1 & 0 & 2 \\ 2 & 1 & 0 \end{bmatrix}$$
 (A5)

Note that the identity element can be read off as the diagonal element(s) of this "division table" and that the inverses can be read off from the first row.

# c. Encoding finite mathematical structures

Since the generating relations of a finite mathematical structure can be specified by simply tabulating all their values as in equations (A1) and (A2), it is straightforward to encode the structure definition as a finite string of integers. Here is a simple example of such an encoding scheme:

$$\langle \# \text{ of sets} \rangle \langle \# \text{ of relations} \rangle \langle \text{set def. 1} \rangle ... \langle \text{rel. def. 1} \rangle ...$$

Here each set definition is simply an integer giving the number of elements in the set. Each relation (function) definition has the following structure:

$$\langle \# \text{ of args} \rangle \langle \text{arg type 1} \rangle ... \langle \text{output type} \rangle \langle \text{value array} \rangle$$

For each of the arguments as well as for the output returned by the relation, the type is simply one of the previously defined sets, numbered  $0, 1, 2, \ldots$  The value tensor simply lists all the values as an array (0-dimensional, 1-dimensional, 2-dimensional, etc. depending on the number of arguments, looping over earlier arguments first in the same way that computer languages such as Fortran store arrays. Elements of the output set are numbered  $0, 1, \ldots$ 

Table 1 illustrates how this works for a number of simple examples. The two equivalent definitions of Boolean algebra corresponding to equations (A1) and (A2) correspond to the strings

$$s_1 = \{182000001100012000000120000111 \\ 200010112000100120001110\},$$

$$s_2 = \{11220001110\}$$
(A6)

respectively; the latter is clearly more economical.

Such an explicit encoding scheme allows mathematical structures to be defined in a way more amenable to computers. We say that an encoding  $s_1$  generates an encoding  $s_2$  if  $s_1$  contains all the sets of  $s_2$  and all relations in  $s_2$  are generated by relations in  $s_1$ . We say that two encodings  $s_1$  and  $s_2$  are equivalent if  $s_1$  generates  $s_2$  and  $s_2$  generates  $s_1$ . In our example above,  $s_1$  and  $s_2$  are equivalent, since they generate each other.

If one wishes to catalog and enumerate all finite mathematical structures, it is convenient to order them by some measure of their complexity (there are many ways of doing this, an issue discussed further in Section?). For example, one could define the complexity H(s) (measured in bits) of an encoding  $s = \{k_1, k_2, ..., k_n\}$  of a mathematical structure as

$$H(s) = \sum_{i=1}^{n} \log_2(2 + k_i).$$
 (A7)

Then the integers 0, 1 and 2 add complexities of 1 bit,  $\log_2(3) \approx 1.6$  bits and 2 bits, respectively, and the two

above encodings of Boolean algebra have complexities of  $H(s_1) = 72$  bits and  $H(s_2) = 16$  bits, respectively, whereas the empty set in Table 1 has 3.6 bits.

This allows us to explicitly define a finite mathematical structure as an equivalence class of encodings. We label it by the encoding that has the lowest complexity, using lexicographical ordering to break any ties, and we define the complexity of the mathematical structure as the complexity of this simplest encoding. In other words, this provides an explicit scheme for enumerating all finite mathematical structures.

## d. Infinite mathematical structures

The more general case of infinite mathematical structures is discussed at length in Section VII. The key point is that there are only countably many computable ones (which include all the the countably many finite structures), and that to enumerate them all, the encoding scheme above must be replaced by one that defines the relations not by explicit tabulation, but by providing an algorithm or computer program that implements them.

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