

# Epistemology as Information Theory: From Leibniz to $\Omega^*$

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## Abstract

In 1686 in his *Discours de métaphysique*, Leibniz points out that if an arbitrarily complex theory is permitted then the notion of “theory” becomes vacuous because there is always a theory. This idea is developed in the modern theory of algorithmic information, which deals with the size of computer programs and provides a new view of Gödel’s work on incompleteness and Turing’s work on uncomputability. Of particular interest is the halting probability  $\Omega$ , whose bits are irreducible, i.e., maximally unknowable mathematical facts. More generally, these ideas constitute a kind of “digital philosophy” related to recent attempts of Edward Fredkin, Stephen Wolfram and others to view the world as a giant computer. There are also connections with recent “digital physics” speculations that the universe might actually be discrete, not continuous. This *système du monde* is presented as a coherent whole in my book *Meta Math!*, which will be published this fall.

## Introduction

I am happy to be here with you enjoying the delicate Scandinavian summer; if we were a little farther north there wouldn’t be any darkness at all. And I am especially delighted to be here delivering the Alan Turing Lecture. Turing’s

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famous 1936 paper is an intellectual milestone that seems larger and more important with every passing year.<sup>1</sup>

People are not merely content to enjoy the beautiful summers in the far north, they also want and need **to understand**, and so they create myths. In this part of the world those myths involve Thor and Odin and the other Norse gods. In this talk, I'm going to present another myth, what the French call a *système du monde*, a system of the world, a speculative metaphysics based on information and the computer.<sup>2</sup>

The previous century had logical positivism and all that emphasis on the philosophy of language, and completely shunned speculative metaphysics, but a number of us think that it is time to start again. There is an emerging digital philosophy and digital physics, a new metaphysics associated with names like Edward Fredkin and Stephen Wolfram and a handful of like-minded individuals, among whom I include myself. As far as I know the terms “digital philosophy” and “digital physics” were actually invented by Fredkin, and he has a large website with his papers and a draft of a book about this. Stephen Wolfram attracted a great deal of attention to the movement and stirred up quite a bit of controversy with his very large and idiosyncratic book on *A New Kind of Science*.

And I have my own book on the subject, in which I've attempted to wrap everything I know and care about into a single package. It's a small book, and amazingly enough it's going to be published by a major New York publisher a few months from now. This talk will be an overview of my book, which presents my own personal version of “digital philosophy,” since each of us who works in this area has a different vision of this tentative, emerging world view. My book is called *Meta Math!*, which may not seem like a serious title, but it's actually a book intended for my professional colleagues as well as for the general public, the high-level, intellectual, thinking public.

“Digital philosophy” is actually a neo-Pythagorean vision of the world, it's just a new version of that. According to Pythagoras, all is number — and by number he means the positive integers, 1, 2, 3, . . . — and God is a math-

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<sup>1</sup>For Turing's original paper, with commentary, see Copeland's *The Essential Turing*.

<sup>2</sup>One reader's reaction (GDC): “Grand unified theories may be like myths, but surely there is a difference between scientific theory and any other narrative?” I would argue that a scientific narrative is more successful than the Norse myths because it explains what it explains more precisely and without having to postulate new gods all the time, i.e., it's a better “compression” (which will be my main point in this lecture; that's how you measure how successful a theory is).

ematician. “Digital philosophy” updates this as follows: Now everything is made out of 0/1 bits, everything is digital software, and God is a computer programmer, not a mathematician! It will be interesting to see how well this vision of the world succeeds, and just how much of our experience and theorizing can be included or shoe-horned within this new viewpoint.<sup>3</sup>

Let me return now to Turing’s famous 1936 paper. This paper is usually remembered for inventing the programmable digital computer via a mathematical model, the Turing machine, and for discovering the extremely fundamental halting problem. Actually Turing’s paper is called “On computable numbers, with an application to the *Entscheidungsproblem*,” and by computable numbers Turing means “real” numbers, numbers like  $e$  or  $\pi = 3.1415926\dots$  that are measured with infinite precision, and that can be computed with arbitrarily high precision, digit by digit without ever stopping, on a computer.

Why do I think that Turing’s paper “On computable numbers” is so important? Well, in my opinion it’s a paper on epistemology, because we only understand something if we can program it, as I will explain in more detail later. And it’s a paper on physics, because what we can actually compute depends on the laws of physics in our particular universe and distinguishes it from other possible universes. And it’s a paper on ontology, because it shows that some real numbers are **uncomputable**, which I shall argue calls into question their very existence, their mathematical and physical existence.<sup>4</sup>

To show how strange uncomputable real numbers can be, let me give a

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<sup>3</sup>Of course, a system of the world can only work by omitting everything that doesn’t fit within its vision. The question is how much will fail to fit, and conversely, how many things will this vision be able to help us to understand. Remember, if one is wearing rose colored glasses, everything seems pink. And as Picasso said, theories are lies that help us to see the truth. No theory is perfect, and it will be interesting to see how far this digital vision of the world will be able to go.

<sup>4</sup>You might exclaim (GDC), “You can’t be saying that before Turing and the computer no one understood anything; that can’t be right!” My response to this is that before Turing (and my theory) people could understand things, but **they couldn’t measure how well** they understood them. Now you can measure that, in terms of the degree of compression that is achieved. I will explain this later at the beginning of the section on computer epistemology. Furthermore, programming something forces you to understand it better, it forces you to really understand it, since you are explaining it **to a machine**. That’s sort of what happens when a student or a small child asks you what at first you take to be a stupid question, and then you realize that this question has in fact done you the favor of forcing you to formulate your ideas more clearly and perhaps even question some of your tacit assumptions.

particularly illuminating example of one, which actually preceded Turing's 1936 paper. It's a very strange number that was invented in a 1927 paper by the French mathematician Emile Borel. Borel's number is sort of an anticipation, a partial anticipation, of Turing's 1936 paper, but that's only something that one can realize in retrospect. Borel presages Turing, which does not in any way lessen Turing's important contribution that so dramatically and sharply clarified all these vague ideas.<sup>5</sup>

Borel was interested in "constructive" mathematics, in what you can actually compute we would say nowadays. And he came up with an extremely strange non-constructive real number. You list all possible yes/no questions in French in an immense, an infinite list of all possibilities. This will be what mathematicians call a denumerable or a countable infinity of questions, because it can be put into a one-to-one correspondence with the list of positive integers 1, 2, 3, ... In other words, there will be a first question, a second question, a third question, and in general an  $N$ th question.

You can imagine all the possible questions to be ordered by size, and within questions of the same size, in alphabetical order. More precisely, you consider all possible strings, all possible finite sequences of symbols in the French alphabet, including the blank so that you get words, and the period so that you have sentences. And you imagine filtering out all the garbage and being left only with grammatical yes/no questions in French. Later I will tell you in more detail how to actually do this. Anyway, for now **imagine** doing this, and so there will be a first question, a second question, an  $N$ th question.

And the  $N$ th digit or the  $N$ th bit after the decimal point of Borel's number answers the  $N$ th question: It will be a 0 if the answer is no, and it'll be a 1 if the answer is yes. So the binary expansion of Borel's number contains the answer to every possible yes/no question! It's like having an oracle, a Delphic oracle that will answer every yes/no question!

How is this possible?! Well, according to Borel, it isn't really possible, this can't be, it's totally unbelievable. This number is only a mathematical fantasy, it's not for real, it cannot claim a legitimate place in our ontology. Later I'll show you a modern version of Borel's number, my halting probability  $\Omega$ . And I'll tell you why some contemporary physicists, real physicists, not mavericks, are moving in the direction of digital physics.

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<sup>5</sup>I learnt of Borel's number by reading Tasic's *Mathematics and the Roots of Postmodern Thought*, which also deals with many of the issues discussed here.

[Actually, to make Borel's number as real as possible, you have to avoid the problem of filtering out all the yes/no questions. And you have to use decimal digits, you can't use binary digits. You number all the possible finite strings of French symbols including blanks and periods, which is quite easy to do using a computer. Then the  $N$ th digit of Borel's number is 0 if the  $N$ th string of characters in French is ungrammatical and not proper French, it's 1 if it's grammatical, but not a yes/no question, it's 2 if it's a yes/no question that cannot be answered (e.g., "Is the answer to this question 'no'?"), it's 3 if the answer is no, and it's 4 if the answer is yes.]

*Geometrically* a real number is the most straightforward thing in the world, it's just a point on a line. That's quite natural and intuitive. But *arithmetically*, that's another matter. The situation is quite different. From an arithmetical point of view reals are extremely problematical, they are fraught with difficulties!

Before discussing my  $\Omega$  number, I want to return to the fundamental question of what does it mean to understand. How do we explain or comprehend something? What is a theory? How can we tell whether or not it's a successful theory? How can we measure how successful it is? Well, using the ideas of information and computation, that's not difficult to do, and the central idea can even be traced back to Leibniz's 1686 *Discours de métaphysique*.

## **Computer Epistemology: What is a mathematical or scientific theory? How can we judge whether it works or not?**

In Sections V and VI of his *Discourse on Metaphysics*, Leibniz asserts that God simultaneously maximizes the variety, diversity and richness of the world, and minimizes the conceptual complexity of the set of ideas that determine the world. And he points out that for any finite set of points there is always a mathematical equation that goes through them, in other words, a law that determines their positions. But if the points are chosen at random, that equation will be extremely complex.

This theme is taken up again in 1932 by Hermann Weyl in his book *The Open World* consisting of three lectures he gave at Yale University on the metaphysics of modern science. Weyl formulates Leibniz's crucial idea in

the following extremely dramatic fashion: If one permits arbitrarily complex laws, then the concept of law becomes vacuous, because there is always a law! Then Weyl asks, how can we make more precise the distinction between mathematical simplicity and mathematical complexity? It seems to be very hard to do that. How can we measure this important parameter, without which it is impossible to distinguish between a successful theory and one that is completely unsuccessful?

This problem is taken up and I think satisfactorily resolved in the new mathematical theory I call *algorithmic information theory*. The epistemological model that is central to this theory is that a scientific or mathematical theory is a computer program for calculating the facts, and the smaller the program, the better. The complexity of your theory, of your law, is measured in bits of software:

$$\begin{array}{c} \text{program (bit string)} \longrightarrow \mathbf{Computer} \longrightarrow \text{output (bit string)} \\ \text{theory} \longrightarrow \mathbf{Computer} \longrightarrow \text{mathematical or scientific facts} \\ \text{Understanding is compression!} \end{array}$$

Now Leibniz’s crucial observation can be formulated much more precisely. For any finite set of scientific or mathematical facts, there is always a theory that is exactly as complicated, exactly the same size in bits, as the facts themselves. (It just directly outputs them “as is,” without doing any computation.) But that doesn’t count, that doesn’t enable us to distinguish between what can be comprehended and what cannot, because there is always a theory that is as complicated as what it explains. A theory, an explanation, is only successful to the extent to which it compresses the number of bits in the facts into a much smaller number of bits of theory. Understanding is compression, comprehension is compression! That’s how we can tell the difference between real theories and *ad hoc* theories.<sup>6</sup>

What can we do with this idea that an explanation has to be simpler than what it explains? Well, the most important application of these ideas that I have been able to find is in metamathematics, it’s in discussing what mathematics can or cannot achieve. You simultaneously get an information-theoretic, computational perspective on Gödel’s famous 1931 incompleteness

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<sup>6</sup>By the way, Leibniz also mentions complexity in Section 7 of his *Principles of Nature and Grace*, where he asks the amazing question, “Why is there something rather than nothing? For nothing is simpler and easier than something.”

theorem, and on Turing's famous 1936 halting problem. How?<sup>7</sup>

Here's how! These are my two favorite information-theoretic incompleteness results:

- You need an  $N$ -bit theory in order to be able to prove that a specific  $N$ -bit program is "elegant."
- You need an  $N$ -bit theory in order to be able to determine  $N$  bits of the numerical value, of the base-two binary expansion, of the halting probability  $\Omega$ .

Let me explain.

What is an elegant program? It's a program with the property that no program written in the same programming language that produces the same output is smaller than it is. In other words, an elegant program is the most concise, the simplest, the best theory for its output. And there are infinitely many such programs, they can be arbitrarily big, because for any computational task there has to be at least one elegant program. (There may be several if there are ties, if there are several programs for the same output that have exactly the minimum possible number of bits.)

And what is the halting probability  $\Omega$ ? Well, it's defined to be the probability that a computer program generated at random, by choosing each of its bits using an independent toss of a fair coin, will eventually halt. Turing is interested in whether or not individual programs halt. I am interested in trying to prove what are the bits, what is the numerical value, of the halting probability  $\Omega$ . By the way, the value of  $\Omega$  depends on your particular choice of programming language, which I don't have time to discuss now.  $\Omega$  is also equal to the result of summing  $1/2$  raised to powers which are the size in bits of every program that halts. In other words, each  $K$ -bit program that halts contributes  $1/2^K$  to  $\Omega$ .

And what precisely do I mean by an  $N$ -bit mathematical theory? Well, I'm thinking of formal axiomatic theories, which are formulated using symbolic logic, not in any natural, human language. In such theories there are always a finite number of axioms and there are explicit rules for mechanically deducing consequences of the axioms, which are called theorems. An  $N$ -bit theory is one for which there is an  $N$ -bit program for systematically

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<sup>7</sup>For an insightful treatment of Gödel as a philosopher, see Rebecca Goldstein's *Incompleteness*.

running through the tree of all possible proofs deducing all the consequences of the axioms, which are all the theorems in your formal theory. This is slow work, but in principle it can be done mechanically, that's what counts. David Hilbert believed that there had to be a single formal axiomatic theory for all of mathematics; that's just another way of stating that math is static and perfect and provides absolute truth.

Not only is this impossible, not only is Hilbert's dream impossible to achieve, but there are in fact an infinity of irreducible mathematical truths, mathematical truths for which essentially the only way to prove them is to add them as new axioms. My first example of such truths was determining elegant programs, and an even better example is provided by the bits of  $\Omega$ . The bits of  $\Omega$  are mathematical facts that are true for no reason (no reason simpler than themselves), and thus violate Leibniz's principle of sufficient reason, which states that if anything is true it has to be true for a reason.

In math the reason that something is true is called its proof. Why are the bits of  $\Omega$  true for no reason, why can't you prove what their values are? Because, as Leibniz himself points out in Sections 33 to 35 of *The Monadology*, the essence of the notion of proof is that you prove a complicated assertion by analyzing it, by breaking it down until you reduce its truth to the truth of assertions that are so simple that they no longer require any proof (self-evident axioms). But if you cannot deduce the truth of something from any principle simpler than itself, then proofs become useless, because **anything** can be proven from principles that are equally complicated, e.g., by directly adding it as a new axiom without any proof. And this is exactly what happens with the bits of  $\Omega$ .

**In other words, the normal, Hilbertian view of math is that all of mathematical truth, an infinite number of truths, can be compressed into a finite number of axioms. But there are an infinity of mathematical truths that cannot be compressed at all, not one bit!**

This is an amazing result, and I think that it has to have profound philosophical and practical implications. Let me try to tell you why.

On the one hand, it suggests that pure math is more like biology than it is like physics. In biology we deal with very complicated organisms and mechanisms, but in physics it is normally assumed that there has to be a theory of everything, a simple set of equations that would fit on a T-shirt and in principle explains the world, at least the physical world. But we have seen that the world of mathematical ideas has infinite complexity, it cannot

be explained with any theory having a finite number of bits, which from a sufficiently abstract point of view seems much more like biology, the domain of the complex, than like physics, where simple equations reign supreme.

On the other hand, this amazing result suggests that even though math and physics are different, they may not be as different as most people think! I mean this in the following sense: In math you organize your computational experience, your lab is the computer, and in physics you organize physical experience and have real labs. But in both cases an explanation has to be simpler than what it explains, and in both cases there are sets of facts that cannot be explained, that are irreducible. Why? Well, in quantum physics it is assumed that there are phenomena that when measured are equally likely to give either of two answers (e.g., spin up, spin down) and that are inherently unpredictable and irreducible. And in pure math we have a similar example, which is provided by the individual bits in the binary expansion of the numerical value of the halting probability  $\Omega$ .

This suggests to me a quasi-empirical view of math, in which one is more willing to add new axioms that are not at all self-evident but that are justified pragmatically, i.e., by their fruitful consequences, just like a physicist would. I have taken the term quasi-empirical from Lakatos. The collection of essays *New Directions in the Philosophy of Mathematics* edited by Tymoczko in my opinion pushes strongly in the direction of a quasi-empirical view of math, and it contains an essay by Lakatos proposing the term “quasi-empirical,” as well as essays of my own and by a number of other people. Many of them may disagree with me, and I’m sure do, but I repeat, in my opinion all of these essays justify a quasi-empirical view of math, what I mean by quasi-empirical, which is somewhat different from what Lakatos originally meant, but is in quite the same spirit, I think.

In a two-volume work full of important mathematical examples, Borwein, Bailey and Girgensohn have argued that experimental mathematics is an extremely valuable research paradigm that should be openly acknowledged and indeed vigorously embraced. They do not go so far as to suggest that one should add new axioms whenever they are helpful, without bothering with proofs, but they are certainly going in that direction and nod approvingly at my attempts to provide some theoretical justification for their entire enterprise by arguing that math and physics are not that different.

In fact, since I began to espouse these heretical views in the early 1970’s, largely to deaf ears, there have actually been several examples of such new pragmatically justified, non-self-evident axioms:

- the  $\mathbf{P} \neq \mathbf{NP}$  hypothesis regarding the time complexity of computations,
- the axiom of projective determinacy in set theory, and
- increasing reliance on diverse unproved versions of the Riemann hypothesis regarding the distribution of the primes.

So people don't need to have theoretical justification; they just do whatever is needed to get the job done. . .

The only problem with this computational and information-theoretic epistemology that I've just outlined to you is that it's based on the computer, and there are uncomputable reals. So what do we do with contemporary physics which is full of partial differential equations and field theories, all of which are formulated in terms of real numbers, **most of which are in fact uncomputable**, as I'll now show. Well, it would be good to get rid of all that and convert to a *digital physics*. Might this in fact be possible?! I'll discuss that too.

## Computer Ontology: How real are real numbers? What is the world made of?

How did Turing prove that there are uncomputable reals in 1936? He did it like this. Recall that the possible texts in French are a countable or denumerable infinity and can be placed in an infinite list in which there is a first one, a second one, etc. Now let's do the same thing with all the possible computer programs (first you have to choose your programming language). So there is a first program, a second program, etc. Every computable real can be calculated digit by digit by some program in this list of all possible programs. Write the numerical value of that real next to the programs that calculate it, and cross off the list all the programs that do not calculate an individual computable real. We have converted a list of programs into a list of computable reals, and no computable real is missing.

Next discard the integer parts of all these computable reals, and just keep the decimal expansions. Then put together a new real number by changing every digit on the diagonal of this list (this is called Cantor's diagonal method; it comes from set theory). So your new number's first digit differs from the first digit of the first computable real, its second digit differs from

the second digit of the second computable real, its third digit differs from the third digit of the third computable real, and so forth and so on. So it can't be in the list of all computable reals and it has to be uncomputable. And that's Turing's uncomputable real number!<sup>8</sup>

Actually, there is a much easier way to see that there are uncomputable reals by using ideas that go back to Emile Borel (again!). Technically, the argument that I'll now present uses what mathematicians call *measure theory*, which deals with probabilities. So let's just look at all the real numbers between 0 and 1. These correspond to points on a line, a line exactly one unit in length, whose leftmost point is the number 0 and whose rightmost point is the number 1. The total length of this line segment is of course exactly one unit. But I will now show you that all the computable reals in this line segment can be covered using intervals whose total length can be made as small as desired. In technical terms, the computable reals in the interval from 0 to 1 are a set of measure zero, they have zero probability.

How do you cover all the computable reals? Well, remember that list of all the computable reals that we just diagonalized over to get Turing's uncomputable real? This time let's cover the first computable real with an interval of size  $\epsilon/2$ , let's cover the second computable real with an interval of size  $\epsilon/4$ , and in general we'll cover the  $N$ th computable real with an interval of size  $\epsilon/2^N$ . The total length of all these intervals (which can conceivably overlap or fall partially outside the unit interval from 0 to 1), is exactly equal to  $\epsilon$ , which can be made as small as we wish! In other words, there are arbitrarily small coverings, and the computable reals are therefore a set of measure zero, they have zero probability, they constitute an infinitesimal fraction of all the reals between 0 and 1. So if you pick a real at random between 0 and 1, with a uniform distribution of probability, it is infinitely unlikely, though possible, that you will get a computable real!

What disturbing news! Uncomputable reals are not the exception, they are the majority! How strange!

In fact, the situation is even worse than that. As Emile Borel points out on page 21 of his final book, *Les nombres inaccessibles* (1952), without making any reference to Turing, most individual reals are not even uniquely specifiable, they cannot even be named or pointed out, no matter how non-constructively, because of the limitations of human languages, which permit

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<sup>8</sup> *Technical Note:* Because of **synonyms** like  $.345999\dots = .346000\dots$  you should avoid having any 0 or 9 digits in Turing's number.

only a countable infinity of possible texts. The individually accessible or nameable reals are also a set of measure zero. Most reals are un-nameable, with probability one! I rediscovered this result of Borel's on my own in a slightly different context, in which things can be done a little more rigorously, which is when one is dealing with a formal axiomatic theory or an **artificial** formal language instead of a natural human language. That's how I present this idea in *Meta Math!*.

So if most individual reals will forever escape us, why should we believe in them?! Well, you will say, because they have a pretty structure and are a nice theory, a nice game to play, with which I certainly agree, and also because they have important practical applications, they are needed in physics. Well, perhaps not! Perhaps physics can give up infinite precision reals! How? Why should physicists want to do that?

Because it turns out that there are actually many reasons for being skeptical about the reals, in classical physics, in quantum physics, and particularly in more speculative contemporary efforts to cobble together a theory of black holes and quantum gravity.

First of all, as my late colleague the physicist Rolf Landauer used to remind me, no physical measurement has ever achieved more than a small number of digits of precision, not more than, say, 15 or 20 digits at most, and such high-precision experiments are rare masterpieces of the experimenter's art and not at all easy to achieve.

This is only a practical limitation in classical physics. But in quantum physics it is a consequence of the Heisenberg uncertainty principle and wave-particle duality (de Broglie). According to quantum theory, the more accurately you try to measure something, the smaller the length scales you are trying to explore, the higher the energy you need (the formula describing this involves Planck's constant). That's why it is getting more and more expensive to build particle accelerators like the one at CERN and at Fermilab, and governments are running out of money to fund high-energy physics, leading to a paucity of new experimental data to inspire theoreticians.

Hopefully new physics will eventually emerge from astronomical observations of bizarre new astrophysical phenomena, since we have run out of money here on earth! In fact, currently some of the most interesting physical speculations involve the thermodynamics of black holes, massive concentrations of matter that seem to be lurking at the hearts of most galaxies. Work by Stephen Hawking and Jacob Bekenstein on the thermodynamics of black holes suggests that any physical system can contain only a finite amount of

information, a finite number of bits whose possible maximum is determined by what is called the Bekenstein bound. Strangely enough, this bound on the number of bits grows as the surface area of the physical system, not as its volume, leading to the so-called “holographic” principle asserting that in some sense space is actually two-dimensional even though it appears to have three dimensions!

So perhaps continuity is an illusion, perhaps everything is really discrete. There is another argument against the continuum if you go down to what is called the Planck scale. At distances that extremely short our current physics breaks down because spontaneous fluctuations in the quantum vacuum should produce mini-black holes that completely tear spacetime apart. And that is not at all what we see happening around us. So perhaps distances that small **do not exist**.

Inspired by ideas like this, in addition to *a priori* metaphysical biases in favor of discreteness, a number of contemporary physicists have proposed building the world out of discrete information, out of bits. Some names that come to mind in this connection are John Wheeler, Anton Zeilinger, Gerard 't Hooft, Lee Smolin, Seth Lloyd, Paola Zizzi, Jarmo Mäkelä and Ted Jacobson, who are real physicists. There is also more speculative work by a small cadre of cellular automata and computer enthusiasts including Edward Fredkin and Stephen Wolfram, whom I already mentioned, as well as Tommaso Toffoli, Norman Margolus, and others.

And there is also an increasing body of highly successful work on quantum computation and quantum information that is not at all speculative, it is just a fundamental reworking of standard 1920's quantum mechanics. Whether or not quantum computers ever become practical, the workers in this highly popular field have clearly established that it is illuminating to study sub-atomic quantum systems in terms of how they process qubits of quantum information and how they perform computation with these qubits. These notions have shed completely new light on the behavior of quantum mechanical systems.

Furthermore, when dealing with complex systems such as those that occur in biology, thinking about information processing is also crucial. As I believe Seth Lloyd said, the most important thing in understanding a complex system is to determine how it represents information and how it processes that information, i.e., what kinds of computations are performed.

And how about the entire universe, can it be considered to be a computer? Yes, it certainly can, it is constantly computing its future state from its

current state, it's constantly computing its own time-evolution! And as I believe Tom Toffoli pointed out, actual computers like your PC just hitch a ride on this universal computation!

So perhaps we are not doing violence to Nature by attempting to force her into a digital, computational framework. Perhaps she has been flirting with us, giving us hints all along, that she is really discrete, not continuous, hints that we choose not to hear, because we are so much in love and don't want her to change!

For more on this kind of new physics, see the books by Smolin and von Baeyer in the bibliography. Several more technical papers on this subject are also included there.

## Conclusion

Let me now wrap this up and try to give you a present to take home, more precisely, a piece of homework. In extremely abstract terms, I would say that the problem is, as was emphasized by Ernst Mayr in his book *This is Biology*, that the current philosophy of science deals more with physics and mathematics than it does with biology. But let me try to put this in more concrete terms and connect it with the spine, with the central thread, of the ideas in this talk.

To put it bluntly, a closed, static, eternal fixed view of math can no longer be sustained. As I try to illustrate with examples in my *Meta Math!* book, math actually advances by inventing new concepts, by completely changing the viewpoint. Here I emphasized new axioms, increased complexity, more information, but what really counts are new ideas, new concepts, new viewpoints. And that leads me to the crucial question, crucial for a proper open, dynamic, time-dependent view of mathematics,

### **“Where do new mathematical ideas come from?”**

I repeat, math does not advance by mindlessly and mechanically grinding away deducing all the consequences of a fixed set of concepts and axioms, not at all! It advances with new concepts, new definitions, new perspectives, through revolutionary change, paradigm shifts, not just by hard work.

In fact, I believe that this is actually the central question in biology as well as in mathematics, it's the mystery of creation, of creativity:

**“Where do new mathematical and biological ideas come from?”**  
**“How do they emerge?”**

Normally one equates a new biological idea with a new species, but in fact every time a child is born, that’s actually a new idea incarnating; it’s reinventing the notion of “human being,” which changes constantly.

I have no idea how to answer this extremely important question; I wish I could. Maybe **you** will be able to do it. Just try! You might have to keep it cooking on a back burner while concentrating on other things, but don’t give up! All it takes is a new idea! Somebody has to come up with it. Why not you?<sup>9</sup>

## **Appendix: Leibniz and the Law**

I am indebted to Professor Ugo Pagallo for explaining to me that Leibniz, whose ideas and their elaboration were the subject of my talk, is regarded as just as important in the field of law as he is in the fields of mathematics and philosophy.

The theme of my lecture was that if a law is arbitrarily complicated, then it is not a law; this idea was traced via Hermann Weyl back to Leibniz. In mathematics it leads to my  $\Omega$  number and the surprising discovery of

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<sup>9</sup>I’m not denying the importance of Darwin’s theory of evolution. But I want much more than that, I want a profound, extremely general mathematical theory that captures the essence of what life is and why it evolves. I want a theory that gets to the heart of the matter. And I suspect that any such theory will necessarily have to shed new light on mathematical creativity as well. Conversely, a deep theory of mathematical creation might also cover biological creativity.

A reaction from Gordana Dodig-Crnkovic: “Regarding Darwin and Neo-Darwinism I agree with you — it is a very good idea to go beyond. In my view there is nothing more beautiful and convincing than a good mathematical theory. And I do believe that it must be possible to express those thoughts in a much more general way... I believe that it is a very crucial thing to try to formulate life in terms of computation. Not to say life is nothing more than a computation. But just to explore how far one can go with that idea. Computation seems to me a very powerful tool to illuminate many things about the material world and the material ground for mental phenomena (including creativity)... Or would you suggest that creativity is given by God’s will? That it is the very basic axiom? Isn’t it possible to relate to pure chance? Chance and selection? Wouldn’t it be a good idea to assume two principles: law and chance, where both are needed to reconstruct the universe in computational terms? (like chaos and cosmos?)”

completely lawless regions of mathematics, areas in which there is absolutely no structure or pattern or way to understand what is happening.

The principle that an arbitrarily complicated law is not a law can also be interpreted with reference to the legal system. It is not a coincidence that the words “law” and “proof” and “evidence” are used in jurisprudence as well as in science and mathematics. In other words, the rule of law is equivalent to the rule of reason, but if a law is sufficiently complicated, then it can in fact be completely arbitrary and incomprehensible.

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