# Universality and Self-Reference: Alan Turing's Legacy in Logic and Computing

Dexter Kozen Computer Science Department Cornell University

Braga, July 19, 2012

◆□▶ ◆□▶ ★□▶ ★□▶ □ のQ@

# Alan Mathison Turing (23 June 1912 - 7 June 1954)



#### Chief contributions

- The Turing machine, including a definition of computability, the concepts of universality and the stored program computer (1936)
- Cracking the Enigma code (1939–42)
- The Turing test and contributions in artificial intelligence and brain modeling (1948–50)

ション ふゆ く 山 マ チャット しょうくしゃ

# Brief Chronology of Alan Turing's Life

1912, 23 June: Birth, Paddington, London 1931-34: Undergraduate at King's College, Cambridge University 1932-35: Quantum mechanics, probability, logic 1935: Elected fellow of King's College, Cambridge 1936: The Turing machine, computability, universal machine 1936-38: Princeton, PhD in logic, algebra, number theory 1938-39: Cambridge, Bletchley Park, work on German Enigma 1939-40: The Bombe, machine for Enigma decryption 1939-42: Breaking of U-boat Enigma, saving battle of the Atlantic 1943-45: Anglo-American crypto consultant 1945: National Physical Laboratory, London 1946: Computer and software design 1947-48: Programming, neural nets, and artificial intelligence 1948: Manchester University 1949: First serious mathematical use of a computer 1950: The Turing Test for machine intelligence 1951: Elected Fellow of the Royal Society 1952: Arrested for sexual deviancy, loss of security clearance 1954, 7 June: Suicide by cyanide poisoning, Wilmslow, Cheshire

- A. M. Turing. On computable numbers with an application to the Entscheidungsproblem. Proc. London Math. Soc. 42 (1936), pp. 230D265. Erratum: Ibid. 43 (1937), pp. 544D546.
- The context
- Universality and self-reference in competing formalisms of the time

・ロト ・ 日 ・ ・ 日 ・ ・ 日 ・ ・ つ へ ()

• Turing's definition of computable reals

# Prehistory



Friedrich Ludwig Gottlob Frege (1848–1925)

German mathematician, logician, and philosopher

A sequence of statements in a formal language

 $\varphi_0, \varphi_1, \varphi_2, \dots, \varphi_n$ 

such that each  $\varphi_i$  is either

- an axiom (basic assumption)
- follows from statements earlier in the list by a rule of inference

・ロト ・ 日 ・ エ = ・ ・ 日 ・ うへつ

# Prehistory



Georg Ferdinand Ludwig Philipp Cantor (1845–1918)

▲□▶ ▲□▶ ▲□▶ ▲□▶ ▲□ ● ● ●

- Cantor introduced the concept of cardinality (size) of a set
- Two sets are the same size if there is a one-to-one correspondence between them
- There are infinitely many different sizes of infinite sets

No one shall expel us from the paradise that Cantor has created for us. —David Hilbert

・ロト ・ 日 ・ エ = ・ ・ 日 ・ うへつ

.0 1 0 0 1 0 1 0 1 1 1 1 0 1 0 0 0 0 1 0 1 0 1 0 0 ... . 0 0 0 10... .11 1 1 1 101101... 0 0 1 0 .0 101... .0 0 0 1 0 0 1 0 1 0 0 1 1 0 ... 1 0 1 0 1 0 1 0 0 0 . . . Ω 0 0 10... . 1 0 1 1 0 1 ... . 1 0 0 . 0 0 1 ... .010 0 0 1 0 0 1 100110... 

1 .010010 1 1 0 1 0 0 0 0 1 0 1 0 1 0 0 ...  $\cap$ 1 1 1 0 . . . . 1 0 1 1 . 1 0  $\cap$ 0 1 1 . 0 1  $\cap$ 0  $\cap$  $\cap$  $\cap$ . 0 1 0  $\cap$ 1 .0 .1 1 0 1 0 1 1 0 1 1 0 1 . . . 1 1 .1 0 . 0 1 1 .010 1 0 0 1 1 0 ... 1 0 0 0 1 0 0 0 1 0 1 1

#### .1 0 1 1 1 1 0 1 0 1 0 1 ...

.010 1 1 0 1 0 0 0 0 1 0 10100... . . . . 1  $\cap$  $\cap$ . 1  $\cap$  $\cap$ . 0 . 0  $\cap$  $\cap$  $\cap$ . 0 1 0  $\cap$  $\cap$ .1 1 0 (( $\bigcirc$ 1 1 0 1 ... .1 . 0 .010 1 0 0 1 1 0 ... 1 0 

. . .

### Turn of the Century — The Quest for Formalization



Bertrand Arthur William Russell 3rd Earl Russell (1872–1970)

> Welsh logician, mathematician and philosopher

・ロト ・ 日 ・ ・ 日 ・ ・ 日 ・ ・ つ へ ()

#### If $\varphi(x)$ is a property, one can form its extension

 $\{x \mid \varphi(x)\}.$ 

For any y,

$$y \in \{x \mid \varphi(x)\} \iff \varphi(y).$$

▲□▶ ▲圖▶ ▲臣▶ ★臣▶ ―臣 …の�?

Let

 $b = \{x \mid x \notin x\}.$ 

Then

$$b \in b \iff b \in \{x \mid x \notin x\} \iff b \notin b.$$

<□▶ <□▶ < □▶ < □▶ < □▶ < □ > ○ < ○

Burali–Forti paradox The ordinal number of the set of all ordinals must be an ordinal, and must be the largest ordinal; but there is no largest ordinal.

**Cantor's paradox** The cardinal number of the set of all sets must be the greatest possible cardinal. But for any set A, the cardinal number of the power set of A (set of all subsets of A) > cardinal number of A.

### Turn of the Century — The Quest for Formalization

# PRINCIPIA MATHEMATICA

TO \*56

BY

ALFRED NORTH WHITEHEAD

AND

BERTRAND RUSSELL, F.R.S.



CAMBRIDGE AT THE UNIVERSITY PRESS



Alfred North Whitehead (1861–1947)

\*54.43.  $\vdash$  :.  $\alpha, \beta \in 1$ .  $\supset$  :  $\alpha \cap \beta = \Lambda$  .  $\equiv$  .  $\alpha \cup \beta \in 2$ 

#### Dem.

 $\begin{array}{ll} + \cdot \ast 54 \cdot 26 , \supset + : \cdot \alpha = t'x , \beta = t'y , \supset : \alpha \lor \beta \in 2 . \equiv .x + y . \\ [\ast 51 \cdot 231] & \equiv .t'x \land t'y = \Lambda , \\ [\ast 13 \cdot 12] & \equiv .\alpha \land \beta = \Lambda \\ + \cdot (1) . \ast 11 \cdot 11 \cdot 35 . \supset \\ & + : (\exists x, y) . \alpha = t'x , \beta = t'y , \supset : \alpha \lor \beta \in 2 . \equiv .\alpha \land \beta = \Lambda \\ & + .(2) . \ast 11 \cdot 54 . \ast 52^{-1} . \supset + . \operatorname{Prop} \end{array}$ 

From this proposition it will follow, when arithmetical addition has been defined, that 1 + 1 = 2.

▲□▶ ▲□▶ ▲□▶ ▲□▶ □ のQで

### Turn of the Century — The Quest for Formalization



David Hilbert (1862–1943)

German mathematician

▲□▶ ▲圖▶ ▲臣▶ ★臣▶ ―臣 …の�?

"When we are engaged in investigating the foundations of a science, we must set up a system of axioms which contains an exact and complete description of the relations subsisting between the elementary ideas of that science...But above all I wish to designate the following as the most important among the numerous questions which can be asked with regard to the axioms: To prove that they are not contradictory, that is, that a definite number of logical steps based upon them can never lead to contradictory results. In geometry, the proof of the compatibility of the axioms can be effected by constructing a suitable field of numbers, such that analogous relations between the numbers of this field correspond to the geometrical axioms... On the other hand a direct method is needed for the proof of the compatibility of the arithmetical axioms."

#### Show that Peano Arithmetic is consistent (not self-contradictory).

#### That is, show that there is no Frege-style proof

 $\varphi_0, \varphi_1, \varphi_2, \ldots, \varphi_n, \ldots, \neg \varphi_n$ 

・ロト ・ 日 ・ ・ 日 ・ ・ 日 ・ ・ つ へ ()

# Is there a procedure to determine whether a given a set of Diophantine equations are solvable?

<□▶ <□▶ < □▶ < □▶ < □▶ < □ > ○ < ○

Given a deductive system for a logic and a sentence  $\varphi$  in that logic, can one decide whether  $\varphi$  is provable?

"For the mathematician there is no Ignorabimus, and, in my opinion, not at all for natural science either... The true reason why [no one] has succeeded in finding an unsolvable problem is, in my opinion, that there is no unsolvable problem. In contrast to the foolish Ignoramibus, our credo avers:

> Wir müssen wissen, wir werden wissen! (We must know, we shall know.)"

—David Hilbert, Königsberg, September 1930, opening address to the Society of German Scientists and Physicians

This question was the main inspiration for Turing's work.

# Formalizing Computation

- proved that the Entscheidungsproblem is undecidable for Peano arithmetic
- articulated Church's thesis, later called the Church–Turing thesis
- $\bullet$  created the  $\lambda\text{-calculus}$



Alonzo Church (1903–1995) American mathematician and logician

・ロト ・ 日 ・ ・ 日 ・ ・ 日 ・ ・ つ へ ()

# Formalizing Computation



Kurt Gödel (1906–1978) Austrian logician, mathematician, philosopher of mathematics

- the completeness theorem
- the incompleteness theorem

•  $\mu$ -recursive functions

### The $\mu$ -Recursive Functions

A collection of number-theoretic functions  $\mathbb{N}^k \to \mathbb{N}$ .

- Successor  $s : \mathbb{N} \to \mathbb{N}$ , s(x) = x + 1 is computable.
- Zero  $z: \mathbb{N}^0 \to \mathbb{N}, z() = 0$  is computable.
- Projections  $\pi_n^k : \mathbb{N}^n \to \mathbb{N}, \ \pi_n^k(x_1, \dots, x_n) = x_k, \ 1 \le k \le n$ , are computable.
- Composition If  $f : \mathbb{N}^k \to \mathbb{N}$  and  $g_1, \ldots, g_k : \mathbb{N}^n \to \mathbb{N}$  are computable, then so is  $f(g_1, \ldots, g_k) : \mathbb{N}^n \to \mathbb{N}$  that on  $\overline{x} = x_1, \ldots, x_n$  gives  $f(g_1(\overline{x}), \ldots, g_k(\overline{x}))$ .
- Primitive recursion If  $h_i : \mathbb{N}^{n-1} \to \mathbb{N}$  and  $g_i : \mathbb{N}^{n+k} \to \mathbb{N}$  are computable,  $1 \leq i \leq k$ , then so are  $f_i : \mathbb{N}^n \to \mathbb{N}$ ,  $1 \leq i \leq k$ , defined by mutual induction:

(ロ) (型) (E) (E) (E) (O)

- $f_i(0,\overline{x}) = h_i(\overline{x})$ ,
- $f_i(x+1,\overline{x}) = g_i(x,\overline{x},f_1(x,\overline{x}),\ldots,f_k(x,\overline{x})),$

where  $\overline{x} = x_2, \ldots, x_n$ .

• Unbounded minimization If  $g : \mathbb{N}^{n+1} \to \mathbb{N}$  is computable, then so is  $f : \mathbb{N}^n \to \mathbb{N}$  that on input  $\overline{x} = x_1, \ldots, x_n$  gives the least y such that  $g(z, \overline{x})$  is defined for all z < y and  $g(y, \overline{x}) = 0$  if such a y exists and is undefined otherwise. We denote this by  $f(\overline{x}) = \mu y.(g(y, \overline{x}) = 0)$ .

ション ふゆ く 山 マ チャット しょうくしゃ

Church (1936) published a proof of the equivalence of the  $\mu$ -recursive functions and the  $\lambda$ -calculus, but attributed the result to Kleene.

- Post systems (Emil Post 1936)
- type 0 grammars (Noam Chomsky 1956)
- combinatory logic (Schönfinkel 1925, Haskell Curry 1929)

・ロト ・ 日 ・ ・ 日 ・ ・ 日 ・ ・ つ へ ()

A. M. Turing. On computable numbers with an application to the Entscheidungsproblem. Proc. London Math. Soc. 42 (1936), pp. 230D265. Erratum: Ibid. 43 (1937), pp. 544D546.

- introduced Turing machines
- proved the existence of a universal Turing machine
- defined computable reals and showed that all commonly known reals (e.g.  $e, \pi$ ) are computable
- proved undecidability of the halting problem (and other problems) using a direct application of Cantor's diagonalization argument
- showed that Turing machines and the  $\lambda$ -calculus are computationally equivalent, thereby giving force to Church's thesis

• gave a much simpler proof of the undecidability of the Entscheidungsproblem

## The Turing Machine (Basic Model)



▲□▶ ▲□▶ ▲□▶ ▲□▶ = 三 のへで

If at each stage the motion of a machine (in the sense of §1) is completely determined by the configuration, we shall call the machine an "automatic machine" (or *a*-machine). For some purposes we might use machines (choice machines or *c*-machines) whose motion is only partially determined by the configuration (hence the use of the word "possible" in §1). When such a machine reaches one of these ambiguous configurations, it cannot go on until some arbitrary choice has been made by an external operator. This would be the case if we were using machines to deal with axiomatic systems. In this paper I deal only with automatic machines, and will therefore often omit the prefix *a*-. Each of these systems is powerful enough that programs can be written that manipulate other programs encoded as data

system	programs	data
$\lambda$ -calculus	$\lambda$ -terms	$\lambda$ -terms
combinatory logic	combinator symbols	combinator symbols
$\mu$ -recursive functions	Gödel numberings	natural numbers
Turing machines	Turing machines	strings

In Turing machines: There is an encoding of Turing machines M as strings x and a universal simulator U that on input x # y simulates  $M_x$  (the machine with code x) on input y

Led to the notion of stored-program computer, the prevailing architecture of most computers in existence today

If Turing machines can compute with the codes of other Turing machines, then they can compute with their own codes.

Example: Quines (self-printing programs)

#### С

```
char *s="char *s=%c%s%c;
main()printf(s,34,s,34,10);%c";
main()printf(s,34,s,34,10);
```

Standard ML let val s="let val s=#\$# in String.translate(fn x=>if Char.ord x=36 then s else implode [if Char.ord x=35 then Char.chr 34 else x])s end" in String.translate(fn x=>if Char.ord x=36 then s else implode [if Char.ord x=35 then Char.chr 34 else x])s end

#### Java

```
public class PrintSelf
static StringBuffer self = new StringBuffer("public class PrintSelf
static StringBuffer self = new StringBuffer();
static char quote = '!';
public static void main(String[] args)
quote++; self.insert(69, self); self.insert(69, quote);
self.insert(318, quote); System.out.println(self); ");
static char quote = '!';
public static void main(String[] args)
quote++; self.insert(69, self); self.insert(69, quote);
self.insert(318, quote); System.out.println(self);
```

# Self-Reference



Stephen Cole Kleene (1909–1994)

- Kleene's theorem (equivalence of automata and regular expressions)
- Kleene's theorem (the recursion theorem)
- Kleene's theorem (inductive =  $\Pi_1^1$  in  $\mathbb{N}$ )

▲□▶ ▲□▶ ▲□▶ ▲□▶ □ のQで

## The Recursion Theorem (Kleene, 1938)

#### Theorem

For any total computable function  $\sigma$ , there exists a Turing machine  $M_x$  such that  $M_x$  and  $M_{\sigma(x)}$  compute the same (partial) function.

#### Proof.

Let  $M_v$  be a Turing machine that on input x computes the code of another Turing machine that on input y does the following.

**3** Runs  $M_x$  on input x, using the universal simulator.

**3** If it halts with output  $M_x(x)$ , apply  $\sigma$  to get  $\sigma(M_x(x))$ .

• Runs the machine with that code on y, using the universal simulator. Note that  $M_v$  does not do 1-3 itself, it just computes the code of a machine that does so. Then

$$M_{M_{\mathbf{v}}(x)}(y) = \begin{cases} M_{\sigma(M_{\mathbf{x}}(x))}(y) & \text{if } M_{\mathbf{x}}(x) \text{ halts,} \\ \text{undefined,} & \text{otherwise.} \end{cases}$$

In particular,  $M_{M_{\mathbf{v}}(\mathbf{v})}(y) = M_{\sigma(M_{\mathbf{v}}(\mathbf{v}))}(y)$ , since  $M_{\mathbf{v}}$  is total.

#### Fixpoints in the $\lambda$ -Calculus

The traditional fixpoint combinator Y satisfies

 $Y\sigma = (\lambda x.\sigma(xx))(\lambda x.\sigma(xx))$ 

This is a fixpoint of  $\sigma$ :

$$(\lambda x.\sigma(xx))(\lambda x.\sigma(xx)) \rightarrow \sigma((\lambda x.\sigma(xx))(\lambda x.\sigma(xx)))$$

This does not correspond to the Kleene construction. It is bad because it forces a lazy evaluation strategy. The one that corresponds to the Kleene construction is

$$\mathbf{v} = \lambda \mathbf{x} . \lambda \mathbf{y} . \sigma(\mathbf{x} \mathbf{x}) \mathbf{y} .$$

Then

$$vv = (\lambda x.\lambda y.\sigma(xx)y)v \to \lambda y.\sigma(vv)y$$
$$vvy \to (\lambda y.\sigma(vv)y)y \to \sigma(vv)y.$$

・ロト ・ 日 ・ ・ 日 ・ ・ 日 ・ ・ つ へ ()

Gödel used exactly the same technology to prove his incompleteness theorem.

#### Theorem

- For Peano arithmetic or any sufficiently powerful deductive system for number theory, there exist sentences that are true but not provable<sup>a</sup>.
- On sufficiently powerful consistent deductive system can prove its own consistency.

ション ふゆ く 山 マ チャット しょうくしゃ

<sup>a</sup>unless the system is inconsistent, in which case everything is provable

The second theorem solves Hilbert's second problem negatively.

Let  $\varphi$  be a number-theoretic sentence. Let

 $\vdash \varphi \iff \varphi \text{ is true in } \mathbb{N}$  $\vdash \varphi \iff \varphi \text{ is provable in Peano arithmetic (PA).}$ 

・ロト ・ 日 ・ ・ 日 ・ ・ 日 ・ ・ つ へ ()

Can rewrite 1 as:

There exists  $\varphi$  such that  $\vDash \varphi$  but  $\not\vdash \varphi$  (unless PA is inconsistent).

Let ' $\varphi$ ' be a numeric code for the formula  $\varphi$ . The coding scheme is chosed so that formulas of number theory can talk about other formulas in terms of their codes, manipulate them, do substitutions, etc.

#### Lemma (Gödel's Fixpoint Lemma)

For any formula  $\sigma$  with one free variable x, there exists a fixpoint  $\varphi$  of  $\sigma$ ; that is, a sentence  $\varphi$  such that

$$\vdash \varphi \leftrightarrow \sigma(\varphi').$$

ション ふゆ く 山 マ チャット しょうくしゃ

The sentence  $\varphi$  says, "I satisfy  $\sigma(x)$ ." Moreover, the equivalence is provable in PA.

Let  $x_0$  be a fixed variable. Let subst(x, y, z) be a formula with three free variables x, y, z that says:

"The number z is the code of the formula obtained by substituting the constant whose value is x for all free occurrences of the variable  $x_0$  in the formula whose code is y."

For example, if ' $x_0 + 4x' = 724$ , then subst(7,724,581) would be true if '7 + 4x' = 581.

Now define

$$\tau(x) = \forall y \text{ subst}(x, x, y) \rightarrow \sigma(y) \qquad \qquad \varphi = \tau(\tau(x_0)).$$

・ロト ・ 日 ・ エ = ・ ・ 日 ・ うへつ

#### Proof of the Fixpoint Lemma

$$au(x) = \forall y \text{ subst}(x, x, y) \rightarrow \sigma(y) \qquad \qquad \varphi = \tau(` au(x_0)`).$$

The sentence  $\varphi$  is the desired fixpoint:

$$\begin{array}{ll} \varphi & \Leftrightarrow & \tau('\tau(x_0)') \\ \Leftrightarrow & \forall y \; \text{subst}('\tau(x_0)', '\tau(x_0)', y) \to \sigma(y) \\ \Leftrightarrow & \forall y \; y = '\tau('\tau(x_0)')' \to \sigma(y) \\ \Leftrightarrow & \forall y \; y = '\varphi' \to \sigma(y) \\ \Leftrightarrow & \sigma('\varphi'). \end{array}$$

We have argued semantically, but the whole argument can be carried out in PA, thus

$$\vdash \varphi \leftrightarrow \sigma(\varphi').$$

▲□▶ ▲圖▶ ▲臣▶ ★臣▶ ―臣 …の�?

# Proof of the First Incompleteness Theorem

### Theorem (Gödel's First Incompleteness Theorem)

Suppose PA is consistent. There exists a number-theoretic sentence  $\varphi$  that is true but not provable.

#### Proof.

One can construct a sentence provable(x) such that

$$\vdash \varphi \iff \vdash \mathsf{provable}('\varphi') \tag{1}$$

for all  $\varphi$ . Take  $\varphi$  to be a fixpoint of  $\neg$ provable(x). Then

$$\vdash \varphi \quad \leftrightarrow \quad \neg \mathsf{provable}('\varphi') \tag{2}$$

by the fixpoint lemma<sup>a</sup>. Combining (1) and (2),

$$\vdash \varphi \Rightarrow \vdash \bot,$$

a contradiction, therefore  $\varphi$  is not provable. By (2), it is true.

 ${}^{a}\varphi$  says: "I am not provable."

# Turing's Proof

#### Proof.

Let Con(PA) be the set of theorems of PA, and let  $Th(\mathbb{N})$  be the set of true statements of number theory.

Con(PA) is recursively enumerable: one could build a Turing machine that runs forever and constructs longer and longer proofs, emitting new theorems as they are discovered.

But  $\operatorname{Th}(\mathbb{N})$  is not recursively enumerable: if it were, say by a machine M, then it would be decidable: to decide  $\varphi$ , just run M on both ' $\varphi$ ' and ' $\neg \varphi$ '. One of them is true and will eventually be enumerated. And we know it is not decidable, because we can express the halting problem.

So  $Con(PA) \neq Th(\mathbb{N})$ . Either there is a  $\varphi \in Th(\mathbb{N}) \setminus Con(PA)$ , in which case we are done, or there is a  $\varphi \in Con(PA) \setminus Th(\mathbb{N})$ , in which case  $\neg \varphi \in Th(\mathbb{N}) \setminus Con(PA)$ , and we are also done.

Q. Why are Turing Machines So Great?

◆□ > < 個 > < E > < E > E 9 < 0</p>

Q. Why are Turing Machines So Great?

<□▶ <□▶ < □▶ < □▶ < □▶ < □ > ○ < ○

A. Programmability!

# Turing's Notion of Computable Real Numbers

#### Definition (Turing 1936)

A computable real  $\alpha$  is given by a Turing machine that eventually writes down all the digits in the binary expansion of  $\alpha$ .

Alternative definitions:

#### Definition

A computable Cauchy sequence consists of computable total functions  $\alpha : \mathbb{N} \to \mathbb{Q}$  and  $f : \mathbb{N} \to \mathbb{N}$  such that for all n and for all  $m, k \ge f(n)$ ,  $|\alpha_m - \alpha_k| < 1/n$ .

#### Definition

A computable convergent interval sequence consists of a computable total interval-valued function  $[\alpha, \beta] : \mathbb{N} \to \mathbb{Q}^2$  such that for all n,  $[\alpha_{n+1}, \beta_{n+1}] \subseteq [\alpha_n, \beta_n]$  and  $\beta_n - \alpha_n < 1/n$ .

The latter two definitions (Cauchy sequences and interval sequences) are equivalent: one can go back and forth effectively between representations.

Unfortunately, the Turing representation (enumeration of digits) effectively determines the other two, but not vice versa!

**Q**. Does this mean there are fewer Turing reals than Cauchy sequences and interval sequences?

・ロト ・ 日 ・ エ = ・ ・ 日 ・ うへつ

The latter two definitions (Cauchy sequences and interval sequences) are equivalent: one can go back and forth effectively between representations.

Unfortunately, the Turing representation (enumeration of digits) effectively determines the other two, but not vice versa!

**Q**. Does this mean there are fewer Turing reals than Cauchy sequences and interval sequences?

・ロト ・ 日 ・ エ = ・ ・ 日 ・ うへつ

A. Yes...and no...

# Turing's Notion of Computable Real Numbers

#### Theorem (Turing 1936)

Every Cauchy sequence converges to a Turing real.

#### Proof.

Let  $\alpha$  be the limit of the Cauchy sequence. If  $\alpha$  is rational, then it is clearly computable, as its digit sequence is ultimately periodic. If  $\alpha$  is irrational, then eventually arbitrarily long prefixes of the expansion are determined.

・ロト ・ 理 ト ・ ヨ ト ・ ヨ ・ うへつ

Use a different representation: output a sequence  $c_n \in \{-1, 1\}$ . The number represented is

$$c_0 \cdot m + \sum_{i=m}^{\infty} c_i \cdot (2/3)^i$$

▲□▶ ▲□▶ ▲□▶ ▲□▶ ▲□ ● ● ●

where m is the number of leading -1's!

# Obrigado!

◆□ > < 個 > < E > < E > E の < @</p>