# Kolmogorov Complexity and Chaitin's Incompleteness Theorem 

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## Introduction

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Now consider a third coin:

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Why do we feel that the sequence 100110110001010 is more "random" than 111111111111111 and 111111100000000 ? How do I express this notion of randomness in a more formal way?

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To describe sequence II, I may say " 1 times 7 and 0 times 8 ".
To describe sequence III, I have no other way but to read it word by word, "100110110001010".

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To describe sequence III, I have no other way but to read it word by word, "100110110001010".

This leads to the definition of Kolmogorov Complexity.

## Coding Function

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## Definition (Coding Function)

Any function $f: \mathrm{N} \rightarrow \mathrm{N}$ can be considered as a coding function.
The domain of $f$ is the set of code words.
Moreover, we often require $f$ to be computable.
Note that $f$ may not be injective/surjective.

Given a coding function $f$, we define the complexity of a string (i.e. a natural number) with respect to $f$ :

Definition (Complexity w.r.t. f)

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C_{f}(n)= \begin{cases}\min \{I(s): f(s)=n\} & f^{-1}(n) \text { is non-empty } \\ \infty & \text { otherwise }\end{cases}
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And since the complexity is $f$-related, we can compare the "power" of two coding functions.

## Definition (Universal Function)

We say $f$ minorizes $g$, if there is a constant $c$ such that, for all $n$,

$$
C_{f}(n) \leq C_{g}(n)+c
$$

And we say $f$ is universal, if it minorizes every partial recursive function.

And in fact, such a universal function does exist.

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Note that, this theorem can be expressed by a $\Sigma_{6}$-formula in PA.

## Proof.

Let $f_{0}$ be the function which the universal Turing machine computes, namely,

$$
f_{0}(\langle n, x\rangle)=\Phi_{n}(x) .
$$

Then, given a partial recursive function $f$, let $\Phi_{n}$ be a Turing machine that computes $f$. The following holds for all $m$ :

$$
C_{f_{0}}(m) \leq C_{f}(m)+c_{n},
$$

where $c_{n}$ depends only on $n$.

## Kolmogorov Complexity

With the help of Invariance Theorem, we can now define the complexity of a string which is coding-invariant (up to an additive constant).

## Definition (Kolmogorov Complexity)

Fix $f_{0}$ as the function computed by the universal Turing machine. The Kolmogorov Complexity of a string is defined by

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K(n)=C_{f_{0}}(n) .
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The code we use for defining the Kolmogorov complexity of a string is essentially the following: first, describe a Turing machine; then, give that machine an input.
For instance, to code the string " 101010101010101010101010 ", we first select a Turing machine that duplicates the string " 10 " $n$ times for $n$ given, and then assign " $n=12$ ".

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For instance, to code the string " 101010101010101010101010 ", we first select a Turing machine that duplicates the string " 10 " $n$ times for $n$ given, and then assign " $n=12$ ".

Note that, the definition of $K$ depends on the particular enumeration of Turing machines. But one can prove that, if two enumerations are recursively isomorphic, their corresponding Kolmogorov complexity differ only by an additive constant.

## Conditional Kolmogorov Complexity

We can also define the conditional complexity of a string. Given information $m$ for free, what is the shortest string that expresses $n$ ?

Definition (Conditional complexity w.r.t. f)
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And we can prove the parallel result:

## Theorem (Invariance Theorem)

Let $f_{0}$ be the function computed by the universal Turing machine, such that $f_{0}(\langle m,\langle n, x\rangle\rangle)=\Phi_{n}(\langle m, x\rangle)$. Then for every partial recursive function $f$, there exists a constant $c$ such that $C_{f_{0}}(n \mid m) \leq C_{f}(n \mid m)+c$ for all $m, n$.

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Therefore we also can define the conditional Kolmogorov complexity.

## Definition (Conditional Kolmogorov Complexity)

Let $f_{0}$ be as above. The conditional Kolmogorov complexity is defined by

$$
K(n \mid m)=C_{f_{0}}(n \mid m)
$$

## Kolmogorov Complexity

We have the following observations that estimate the upper and lower bounds of Kolmogoroc complexity.

## Observation

- There exists a constant $c$ such that $K(n) \leq I(n)+c$ for all $n$.
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- For each $k$, there exists $n$ such that $K(n) \geq I(n)=k$.

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- For each $k$, there exists $n$ such that $K(n) \geq I(n)=k$.


## Proof.

- Use the Turing machine that copies its input as output.
- Use the Turing machine that erases the first input, followed by the universal Turing machine.
- There are $2^{k}$ binary strings with length $k$, but only $2^{k}-1$ shorter codes.


## Incompressibility and Randomness

Recall that our initial intention was to study the randomness of strings.

## Definition

We say a string is incompressible if $K(n) \geq I(n)$.
We say a string is c-incompressible if $K(n) \geq I(n)-c$.
Intuitively, incompressible strings are random. Now we're going to formalize what it means by saying a finite string is "random", and prove incompressible strings are indeed random in this sense.

The initial idea of Martin-Löf test starts by setting hierarchies for randomness. A string with no zero is absolutely nonrandom; but it is unnatural to fix a frequency $p$ and say all strings with less than $p$ of its total digits being zero are nonrandom. We have to agree that there are different levels of randomness.

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For instance, a string with too many initial zeros is not random. Take

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V_{m}=\{s: s \text { starts with } m \text { zeros }\}
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and we have a hierarchy of randomness with $V_{0} \supset V_{1} \supset V_{2} \supset \ldots$ The larger $m$ is, the more nonrandom strings in $V_{m}$ are.

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We generalize the above case to obtain the notion of Martin-Löf test.

## Definition (Martin-Löf Test)

Given a total function $\delta: \mathrm{N} \rightarrow \mathrm{N}$, we call the sets $V_{m}=\{x: \delta(x) \geq m\}$ critical regions. We say that $\delta$ is a Martin-Löf test if
(1) The set $V=\left\{\langle m, x\rangle: x \in V_{m}\right\}$ is recursively enumerable;
(3) $\left|\left\{x \in V_{m} \mid I(x)=n\right\}\right| \leq 2^{n-m}$ for all $m, n$.

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Again, we want a universal test instead of a specific one.

## Definition (Universal Martin-Löf Test)

We say $\delta_{0}$ is a universal Martin-Löf test, if for every Martin-Löf test $\delta$, there is a constant $c$ such that $\delta_{0}(x) \geq \delta(x)-c$ for all $x$.

Intuitively, this means that the universal test considers every string to be more nonrandom than any other test, if an additive deviation is ignored. Therefore, it is the tightest test we can ever find.

## Incompressibility and Randomness

And there is indeed a universal test. It is generated by applying the Kolmogorov complexity.

## Theorem

There exists a universal Martin-Löf test, namely $\delta_{0}(x)=I(x)-K(x \mid I(x))-1$.

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## Proof.

We omit the proof of $\left\{\langle m, x\rangle: \delta_{0}(x) \geq m\right\}$ being recursively enumerable, which is done by building a non-increasing sequence $\phi_{n}(x)$ of recursive functions whose limit is $K(x \mid I(x))$.

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For size of critical regions, $V_{m}=\{x: K(x \mid I(x)) \leq I(x)-m-1\}$, and there are only $2^{I(x)-m}-1$ many strings with length less than or equal to $I(x)-m-1$.

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For universality, let $\left\{\delta_{i}\right\}_{i \geq 1}$ be an effective enumeration of all Martin-Löf tests. Fix a test $\delta_{i}$ and an $x$. We sort all strings $s$ of length $I(x)$ in descending order of $\left\langle\delta_{i}(s), s\right\rangle$, and suppose $x$ is the $j$-th element. Then, there is a Turing machine that computes $x$ with input $\langle I(x), i, j\rangle$. By Invariance Theorem, $K(x \mid I(x)) \leq I(i)+I(j)+c$. On the other hand, $j \leq\left|V_{\delta_{i}(x)}\right|$ and therefore $I(j) \leq I(x)-\delta_{i}(x)$. In conclusion, $\delta_{i}(x) \leq I(x)-K(x \mid I(x))+c^{\prime}$.

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For size of critical regions, $V_{m}=\{x: K(x \mid I(x)) \leq I(x)-m-1\}$, and there are only $2^{l(x)-m}-1$ many strings with length less than or equal to $I(x)-m-1$.
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We conclude that randomness defined by Martin-Löf test and incompressibility defined by Kolmogorov complexity coincide.

## Undecidability of $K$

The function $K$ does not look like a recursive function. $K(n)$ is the length of the shortest input with $n$ as the output; however, whether a calculation of a Turing machines halts with the given output is not decidable. We're going to prove that $K$ is indeed not a recursive function.

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## Theorem (Noncomputability Theorem)

$K$ is not partial recursive.

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Suppose not. Let $\phi$ be such a function. Its domain is an infinite r.e. set and thus contains an infinite recursive set, denoted by $A$. Take

$$
\psi(x)=\min \{y \in A: K(y) \geq x\} .
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It is total recursive because $K$ and $\phi$ agree on $A$. By definition of $\psi$, we have $K(\psi(x)) \geq x$.

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$$
K(\psi(x)) \leq C_{\psi}(\psi(x))+c \leq I(x)+c
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and thus $x \leq I(x)+c$, a contradiction.

## Undecidability of $K$

With a similar proof, we'll see another interesting property of the function $K$.

## Theorem

Let $m(x)=\min \{K(y): y \geq x\}$. Then
(1) $m(x)$ goes monotonically to infinity;
(2) but it does so more slowly than any unbounded partial recursive function; more precisely, for any monotonic unbounded partial recursive function $\phi(x)$, we have $m(x)<\phi(x)$ except for finitely many $x$.

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Note that, a function that goes to infinity faster than any recursive function is easy to build. Let $\left\{f_{i}\right\}_{i \in \mathrm{~N}}$ be an enumeration of all partial recursive functions, and $F(n)=\max _{i \leq n} f_{i}(n)$ meets the requirement.

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## Proof.

Monotonicity is obvious.
For unboundedness, it suffices to see that there are only finitely many codes with length $\leq n$ for any given $n$.

## Undecidability of $K$

## Proof. (Cont'd).

Now assume for contradiction that there is a monotonic unbounded partial recursive function $\phi$ such that $\phi(x) \leq m(x)$ for infinitely many $x$. The domain of $\phi$ is an infinite r.e. set. It contains an infinite recursive subset $A$.

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\psi(x)= \begin{cases}\phi(\max \{y \in A: y \leq x\}) & x \geq \min A \\ 0 & \text { otherwise }\end{cases}
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Then $\psi$ is total recursive, monotonic, unbounded, and $\psi(x) \leq m(x)$ for infinitely many $x$.

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Define $M(x)=\max \{y: K(y) \leq x\}$ and $F(x)=\max \{y: \psi(y) \leq x+1\}$. Then,

$$
M(x)+1=\min \{y: m(y)>x\} \leq \min \{y: \psi(y)>x\} \leq F(x)
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for infinitely many $x$. In other words, $F(x)>M(x)$ for infinitely many $x$. Now that $F$ is total recursive, this implies that $K(F(x))>x$ for infinitely many $x$.

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and thus $x<I(x)+c$ for infinitely many $x$, a contradiction.

## Berry Paradox

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The smallest positive integer not definable in under sixty letters.
The Berry paradox says, since there are only finitely many descriptions in under sixty letters, such integer exists. But then, this integer is defined by this sentence, which is under sixty letters.

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In Kolmogorov's theory of coding, this paradox does not appear. Recall that we demand every coding function to be recursive. And if you try to find "the smallest positive integer not definable in under sixty letters" in an effective way, the program ends up in a loop.

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However, the idea of Berry paradox does give us an important insight, which leads to the proof of Chaitin's incompleteness theorem.

## Chaitin's Incompleteness Theorem

Theorem (Chaitin's Incompleteness Theorem)
If $T$ is a consistent recursively enumerable theory that extends PA, then there this a constant $c$ such that $K\left({ }^{\circ} n{ }^{\top}\right) \geq{ }^{r} c{ }^{\top}$ is not provable in $T$ for all $n$.

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## Proof.

Suppose not. We abuse notation; for each $c$, there exists $n$ such that $K(n) \geq c$ is provable in $T$.
Let $\Phi_{m}$ be the Turing machine that enumerates theorems of $T$. Now we can modify $\Phi_{m}$ into a Turing machine such that, given $c$ as an input, by enumerating all theorems of $T$ with $\Phi_{m}$, the machine finds the first proof of $K(n) \geq c$ for some $n$, and send $n$ as the output. Therefore, we have a coding of this $n$ with length $I(c)$. By Invariance Theorem, $K(n) \leq I(c)+c^{\prime}$, where $c^{\prime}$ depends only upon $m$. However, now that we have $c \leq K(n) \leq I(c)+c^{\prime}$, for $c$ sufficiently large this results in a contradiction.

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## Proof.

Suppose not. We abuse notation; for each $c$, there exists $n$ such that $K(n) \geq c$ is provable in $T$.
Let $\Phi_{m}$ be the Turing machine that enumerates theorems of $T$. Now we can modify $\Phi_{m}$ into a Turing machine such that, given $c$ as an input, by enumerating all theorems of $T$ with $\Phi_{m}$, the machine finds the first proof of $K(n) \geq c$ for some $n$, and send $n$ as the output. Therefore, we have a coding of this $n$ with length $I(c)$. By Invariance Theorem, $K(n) \leq I(c)+c^{\prime}$, where $c^{\prime}$ depends only upon $m$. However, now that we have $c \leq K(n) \leq I(c)+c^{\prime}$, for $c$ sufficiently large this results in a contradiction.

Note that, although this is a proof by contradiction, we do obtain a concrete constant $c$ witnessing the theorem. In fact, it suffices to choose $c$ such that $c>I(c)+c^{\prime}$.

## Theorem (Chaitin's Incompleteness Theorem)

If $T$ is a consistent recursively enumerable theory that extends PA, then there this a constant $c$ such that $K\left({ }^{r} n\right) \geq{ }^{r} c^{\top}$ is not provable in $T$ for all $n$.

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Note that, although this is a proof by contradiction, we do obtain a concrete constant $c$ witnessing the theorem. In fact, it suffices to choose $c$ such that $c>I(c)+c^{\prime}$.
Question: Where in the proof do we require the consistency of $T$ ?

And as a corollary, we have:
Corollary (Gödel's First Incompleteness Theorem)
If $T$ is a consistent recursively enumerable theory that extends PA, then there is a formula $\phi$ such that both $\phi$ and $\neg \phi$ are not provable in $T$.

## Proof.

We've proven that there are incompressible strings of each length, and thus there are infinitely many $n$ such that $\neg K\left({ }^{\ulcorner } n^{\top}\right) \geq{ }^{「} c^{\top}$ is not provable.

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Note that, Gödel's second incompleteness theorem does NOT follow from the above proof.

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The following algorithm seems to generate a proof of $K(n) \geq c$ in $T$ : list all strings $s$ with length less than $c$ as input, and check whether we can prove the universal Turing machine halts with output $n$. However, the algorithm does not work because we cannot effectively decide whether a Turing machine halts. Moreover, since now we're given only finitely many strings, there has to be one particular string $s_{0}$, such that we cannot decide the halting problem with $s_{0}$ as input. Question: What is that particular input $s_{0}$ ?

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The answer lies in the proof of Chaitin's Incompleteness Theorem.
We constructed a Turing machine that enumerates all theorems of $T$ to see whether $K(n) \geq c$ is provable. With little modification, we can also construct a Turing machine that checks whether $0 \neq 0$ is a theorem of $T$. We've supposed $T$ is consistent, and thus such a Turing machine does not halt. On the other hand, by Gödel's incompleteness theorem, $T$ cannot prove that this Turing machine does not halt. This is the input we're looking for.

