

Non-context-free languages

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is context free, the language

$$\{0^n 1^n 0^n \mid n \ge 0\}$$

is not.

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is context free, the language

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is not.

Can we write a python program to check if a string w belongs to the language $\{0^n1^n0^n\mid n\geq 0\}$?

Is there a python program that "solves" any possible problem?

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Is there a python program that "solves" any possible problem? Can a computer solve any problem? Is there an algorithm that solves every problem? What is the limit of computation?

Answer by a counting argument

If there are "more" problems than any possible algorithms, then there should be some problem that algorithms cannot solve.

(Think of an algorithm as "a python program.)

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If there are "more" problems than any possible algorithms, then there should be some problem that algorithms cannot solve.

(Think of an algorithm as "a python program.)

However, there are <u>infinitely many</u> python programs and there are <u>infinitely many</u> problems. It is not obvious how to much such an argument formally.

Bijections

Definition

- ▶ A function $f: A \longrightarrow B$ from domain A to range B is **one-to-one** if for any $x \neq y \in A$, $f(x) \neq f(y)$.
- ▶ A function $f: A \longrightarrow B$ from domain A to range B is **onto** if for any $x' \in B$, there exists $x \in A$ such that f(x) = x'.
- ▶ A function $f: A \longrightarrow B$ is a **bijection** (or bijective) if it is one-to-one and onto.

Bijection: examples

For any set A, there is no bijective function $f: A \longrightarrow 2^A$.

Proof.

We prove by contradiction. Assume that there exists a bijective function f from A to 2^A . We construct a set $B \subseteq A$ such that there is no $x \in A$ such that f(x) = B.

For any set A, there is no bijective function $f: A \longrightarrow 2^A$.

Proof.

We prove by contradiction. Assume that there exists a bijective function f from A to 2^A . We construct a set $B \subseteq A$ such that there is no $x \in A$ such that f(x) = B. We define B as follows.

$$B = \{ x \in A \mid x \not\in f(x) \}.$$

Now suppose that there exists $x \in A$ such that f(x) = B. There are two cases to consider:

Case 1: $x \in B$.

For any set A, there is no bijective function $f: A \longrightarrow 2^A$.

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Case 1: $x \in B$.

Case 2: $x \notin B$.

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We prove by contradiction. Assume that there exists a bijective function f from A to 2^A . We construct a set $B \subseteq A$ such that there is no $x \in A$ such that f(x) = B. We define B as follows.

$$B = \{ x \in A \mid x \not\in f(x) \}.$$

Now suppose that there exists $x \in A$ such that f(x) = B. There are two cases to consider:

Case 1: $x \in B$.

Case 2: $x \notin B$.

In both case, we have a contradiction; therefore, our assumption is false. Thus, there is no bijection between A and 2^A .

Example: finite set

B =

Let A=1,2,3,4,5,6,7. Consider function $f:A\longrightarrow 2^A$ defined as

```
f(1) = \{\}
f(2) = \{1, 2, 3\}
f(3) = \{1, 2, 3, 4, 5, 6, 7\}
f(4) = \{1, 3, 5, 7\}
f(5) = \{2, 4, 6\}
f(6) = \{7\}
f(7) = \{1, 2, 3\}
```

Example: finite set

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$$f(6) = \{7\}$$

$$f(7) = \{1, 2, 3\}$$

	1	2	3	4	5	6	7
1							
2							
3							
4							
5							
6							
7							



Example: infinite set

Let $A = \mathbb{N} = \{1, 2, 3, 4, \ldots\}$. Consider function $f: A \longrightarrow 2^A$ defined as

$$\begin{array}{lll} f(1) & = & \{\} \\ f(2) & = & \{1,2,3\} \\ f(3) & = & \{1,2,3,4,5,6,7,\ldots\} \\ f(4) & = & \{1,3,5,7,\ldots\} \\ f(5) & = & \{2,4,6,\ldots\} \\ f(6) & = & \{7\} \\ f(7) & = & \{1,2,3,11,12,13,21,22,23,\ldots\} \\ & \vdots & \vdots \\ B & = & \end{array}$$

J								
	1	2	3	4	5	6	7	
1								
2								
3								
4								
5								
6								
7								
:								

The previous lemma informally states that there are "more" subsets than the number of elements in the set.

Let's think about:

- ► A set of all python programs, and
- A set of all languages.

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Since each python program "solves" at most one language, there are not "enough" python programs to solve all possible language.

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Let's think about:

- ► A set of all python programs, and
- A set of all languages.

Since each python program "solves" at most one language, there are not "enough" python programs to solve all possible language.

But what exactly is a problem that cannot be "solved"?

Decision problems

- ► Given an integer x, is x odd?
- ightharpoonup Given a string w, is w palindrome?
- ▶ Given a string w, is $w \in \{0^n 1^n \mid n \ge 0\}$?
- ightharpoonup Given a map, a starting position s, a destination t, and an integer k, does there exist a path from s to t with distance at most k?
- ightharpoonup Given a program P and input string w, when running P with w as an input, does P terminate?

Decision problems and languages

For this problem:

Given an integer x, is x odd?

we can define a corresponding language

$$L_E = \{, \dots, -6, -4, -2, 0, 2, 4, 6, \dots\}.$$

To solve this problem, given x, we can ask if $x \in L_E$.

We will talk about languages of particular programs. For example, let \mathbb{P} be the set of all python programs. In this case, \mathbb{P} is a language.

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$$\{P \in \mathbb{P} \mid P \text{ always terminates}\}$$

$$\{P\in\mathbb{P}\mid P \text{ always loops}\}$$

 $\{(P,x)\mid P\in\mathbb{P}, \text{when running }P\text{ with }x\text{ as an input, }P\text{ terminates}\}$

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We will talk about languages of particular programs. For example, let $\mathbb P$ be the set of all python programs. In this case, $\mathbb P$ is a language.

 $\{(P,Q,x)\mid P,Q\in\mathbb{P},P(x) \text{ and } Q(x) \text{ terminate with the same output.}\}$

$$\{P\in\mathbb{P}\mid P\text{ always terminates}\}$$

$$\{P\in\mathbb{P}\mid P\text{ always loops}\}$$

$$\{(P,x)\mid P\in\mathbb{P}, \text{when running }P\text{ with }x\text{ as an input, }P\text{ terminates}\}$$

$$\{(P,x)\mid P\in\mathbb{P}, P(x)\text{ terminates}\}$$



```
x = int(input())
if x % 2 == 0:
    print('yes')
else:
    print('no')
```

print('no')

\$ python le.py

10

```
x = int(input())
if x % 2 == 0:
    print('yes')
else:
    print('no')
```

```
$ python le.py
10
yes
$ python le.py
nο
$ python le.py
fjdsklfjsdf
Traceback (most recent call last):
  File "le.py", line 1, in <module>
    x = int(input())
ValueError: invalid literal for int()
with base 10: 'fjdsklfjsdf'
```

```
x = int(input())
if x % 2 == 0:
    print('yes')
else:
    print('no')
```

```
10 out < Q
$ python le.py
10
yes
$ python le.py
nο
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fjdsklfjsdf
Traceback (most recent call last):
  File "le.py", line 1, in <module>
    x = int(input())
ValueError: invalid literal for int()
with base 10: 'fjdsklfjsdf'
$ python le.py <</pre>le.py
```

```
yes
                                           $ python le.py
                                           no
                                           $ python le.py
                                           fjdsklfjsdf
x = int(input())
                                           Traceback (most recent call last):
if x \% 2 == 0:
                                             File "le.py", line 1, in <module>
    print('yes')
                                               x = int(input())
else:
                                           ValueError: invalid literal for int()
    print('no')
                                           with base 10: 'fjdsklfjsdf'
                                           $ python le.py < le.py</pre>
                                           Traceback (most recent call last):
```

\$ python le.py

File "le.py", line 1, in ≼module≽ ∽a~

10

Nice programs

We can systematically modify any python program ${\cal P}$ so that

- ▶ P contains a main function that works with the input as a string.
- ightharpoonup P never crashes. (If the original P crashes, the modified P outputs no.)

```
x = int(input())
if x % 2 == 0:
    print('yes')
else:
    print('no')
```

Nice programs

We can systematically modify any python program P so that

- ▶ *P* contains a main function that works with the input as a string.
- \triangleright P never crashes. (If the original P crashes, the modified P outputs no.)

```
import sys
                                      def main(w):
                                         try:
                                             x = int(w)
                                             if x \% 2 == 0:
x = int(input())
                                                print('yes')
if x \% 2 == 0:
                                             else:
   print('yes')
                                                print('no')
else:
                                         except:
   print('no')
                                             print('no')
                                      if __name__ == '__main__':
                                         w = sys.stdin.read()
                                         main(w)
```

When running a program

When you run a program P with input x, there are three possible outcomes:

- P terminates and outputs yes,
- ▶ P terminates and outputs **no**, and
- ▶ *P* does not terminate. (It runs forever.)

When running a program

When you run a program P with input x, there are three possible outcomes:

- P terminates and outputs yes,
- P terminates and outputs no, and
- ▶ *P* does not terminate. (It runs forever.)

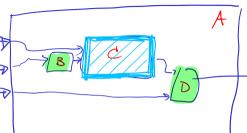
Remarks: if P crashes (even after modification), we treat it as if it terminates and outputs **no**.

Proving impossibility

JEUIR GUTTITA

Goal! etrus (language) L 60t 92'90t

Proving impossibility

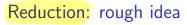


d solves language R

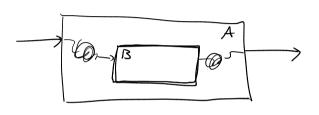
A solves language L

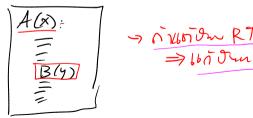
$$A(x,y,z) = D(C(x,B(y)),z)$$
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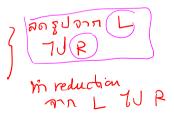




A bestern L B bestern R







Let $\mathbb P$ be the set of all python programs. Let the language A be

 $\{P\in\mathbb{P}\mid \text{when running }P\text{ with }P\text{ as an input, }P\text{ terminates}\}$

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We use a function call notation P(x) when refering to the execution of program P with input x.

We restate the definition of A as

$$\{P\in\mathbb{P}\mid P(P) \text{ terminates}\}.$$

Deciders

We say that a python program P decides the language L if for any input string x, P when running with x as an input,

- P always terminates,
- ightharpoonup P outputs **yes**, if $x \in L$, and
- ightharpoonup P outputs **no**, if $x \not\in L$.

Deciders: more examples

Let $\mathbb P$ be the set of all python programs. Let the language A be

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We restate the definition of A as

$$\{P\in\mathbb{P}\mid P(P) \text{ terminates}\}.$$

Not a decider for A

```
Input: python program P (as a string)
```

- 1. Load module P as Pmod
- 2. Call Pmod.main(P)
- 3. print('yes') # we reach this line,
 # only if M.main(P) terminates

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Lemma 2

There is no python program that decides A.

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We will see the proof at the end of class.

Undecidability

If we believe that anything that a computer can do can be written as a python program,

Undecidability

If we believe that anything that a computer can do can be written as a python program, and there is no python program that decides A, when we say that

A is undecidable.

Language A will be very important later on, we give it a proper name as $\operatorname{SELFHALT}$.

The proof as a table

List all python programs in \mathbb{P} as P_1, P_2, P_3, \ldots

	P_1	P_2	P_3	P_4	P_5	P_6	P_7	
P_1								
P_2								
P_2 P_3								
P_4								
P_5								
$\begin{array}{c c} P_4 \\ \hline P_5 \\ \hline P_6 \end{array}$								
:								
(B)								

What does B do on each input program P_i ?

Another language HALT

Let

 $HALT = \{(P, w) \mid P \text{ is a python program such that } P(w) \text{ terminates} \}$

We shall prove that HALT is also undecidable (if we believe that python programs represent all possible computation).

Lemma 3

HALT is undecidable.

Proof.

We prove the lemma by contradiction. Assume that there is a python program P that decides HALT .

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Proof.

We prove the lemma by contradiction. Assume that there is a python program P that decides HALT .

We construct a program ${\cal C}$ as follows

```
Program C
Input Q
1. Load P as module Pmod
2. if Pmod.main(Q,Q) == 'yes':
3. print('yes')
4. else
5. print('no')
```

Proof.

We prove the lemma by contradiction. Assume that there is a python program P that decides Halt .

We construct a program ${\cal C}$ as follows

```
Program C
Input Q
1. if P(Q,Q) == 'yes':
2. print('yes')
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Proof.

We prove the lemma by contradiction. Assume that there is a python program P that decides HALT .

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Given program P, we can construct a program C that decides SelfHalt.

Proof.

We prove the lemma by contradiction. Assume that there is a python program P that decides HALT .

We construct a program C as follows

```
Program C
Input Q
1. if P(Q,Q) == 'yes':
2. print('yes')
3. else
4. print('no')
```

Given program P, we can construct a program C that decides $\operatorname{SELFHALT}$. However, we know that $\operatorname{SELFHALT}$ is undecidable; thus, we reach a contradiction.

We conclude that there does not exist a python program P that decides HALT.



▶ We show that if HALT is decidable, then SELFHALT is also decidable.

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- ► However, SelfHalt is undecidable.

- ▶ We show that if HALT is decidable, then SELFHALT is also decidable.
- ► However, SelfHalt is undecidable.
- ▶ We conclude that HALT is also undecidable.

Reduction in picture

Let $Accept = \{(P, w) \mid P \in \mathbb{P} \text{ and } P(w) \text{ terminates with acceptance} \}.$

Lemma 4

ACCEPT is undecidable.

Proof.

We prove the lemma by contradiction. Assume that there is a python program Q that decides \mathbf{Accept} .

Let $Accept = \{(P, w) \mid P \in \mathbb{P} \text{ and } P(w) \text{ terminates with acceptance} \}.$

Lemma 4

ACCEPT is undecidable.

Proof.

We prove the lemma by contradiction. Assume that there is a python program Q that decides ${\it Accept}$. We construct a program C that decides ${\it Halt}$ as follows

Let $Accept = \{(P, w) \mid P \in \mathbb{P} \text{ and } P(w) \text{ terminates with acceptance} \}.$

Lemma 4

ACCEPT is undecidable.

Proof.

We prove the lemma by contradiction. Assume that there is a python program Q that decides ${\it Accept}$. We construct a program C that decides ${\it Halt}$ as follows

```
Program C
Input P,w
1. Replace every "print('no')" statement in P with "print('yes')"
1. if Q(P,w) == 'yes':
2. print('yes')
3. else
4. print('no')
```

Proof (cont.)

```
Program C
Input P,w
1. Replace every "print('no')" statement in P with "print('yes')"
1. if Q(P,w) == 'yes':
2. print('yes')
3. else
4. print('no')
```

We have to make sure that our reduction is correct by considering two cases.

Case 1: when P(w) halts.

Proof (cont.)

```
Program C
Input P,w
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Case 1: when P(w) halts.

Case 2: when P(w) does not halt.

Proof (cont.)

```
Program C
Input P,w
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We have to make sure that our reduction is correct by considering two cases.

Case 1: when P(w) halts.

Case 2: when P(w) does not halt.

Since in both cases, C answers correctly, we know that given program Q deciding ACCEPT, we can construct a program C that decides HALT. However, we know that HALT is undecidable; thus, we reach a contradiction. We conclude that ACCEPT is also undecidable.

Reduction from Halt to Accept in picture

How about REJECT?

Let

$$\mathrm{Reject} = \{(P, w) \mid P \in \mathbb{P} \text{ and } P \text{ rejects } w\}.$$

Lemma 5

There is no python program that decides $\operatorname{SelfHalt}$.

Proof.

We prove by contradiction. Assume that there is a python program ${\cal P}$ that decides SelfHalt.

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Proof.

We prove by contradiction. Assume that there is a python program P that decides $\operatorname{SELFHALT}$.

We describe a python program B that reads a string Q as an input as follows:

```
Program B
Input Q
1. Load P as module Pmod
2. if Pmod.main(Q) == 'yes':  # when Pmod outputs yes
3. while True: pass  # loop forever
4. else:  # when Pmod outputs no
5. quit()  # halt
```

Given program Q as an input, B loops forever when

Lemma 5

There is no python program that decides SelfHalt.

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2. if Pmod.main(Q) == 'yes':  # when Pmod outputs yes
3. while True: pass  # loop forever
4. else:  # when Pmod outputs no
5. quit()  # halt
```

Given program ${\cal Q}$ as an input, ${\cal B}$ loops forever when It terminates when



We know that

- ightharpoonup B(Q) loops when Q(Q) terminates, and
- ▶ B(Q) terminates when Q(Q) loops.

Does running B using B as an input terminate?

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Does running ${\cal B}$ using ${\cal B}$ as an input terminate?

Let's try to plug in Q=B. We have

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Does running B using B as an input terminate?

Let's try to plug in Q = B. We have

- ▶ B(B) loops when B(B) terminates, and
- ightharpoonup B(B) terminates when B(B) loops.

Since either B(B) loops or terminates, and we cannot be in any of the cases, we obtain a contradiction.

Therefore, we conclude that program P does not exist.



Python as computation

Do you believe in this assumption:

Anything that a computer can do can be written as a python program.

Turing machines

Anything that a computer can do can be carried out using Turing machines.

Turing machines

Anything that a computer can do can be carried out using Turing machines.

Any possible computation can be performed by Turing machines.