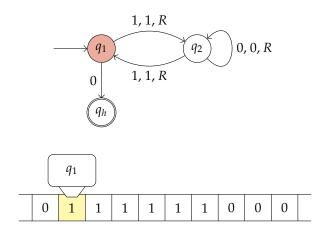
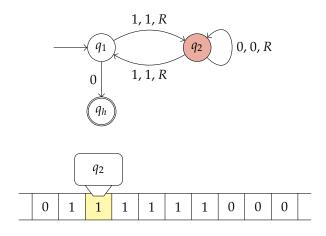
#### **PHIL 222**

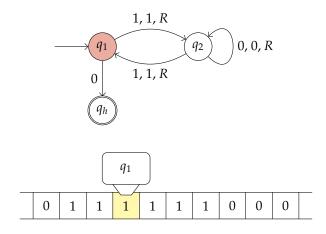
## Philosophical Foundations of Computer Science Week 3, Tuesday

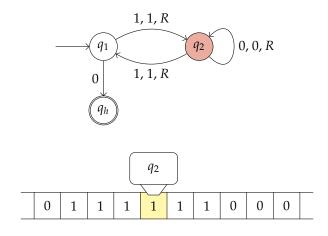
Sept. 10, 2024

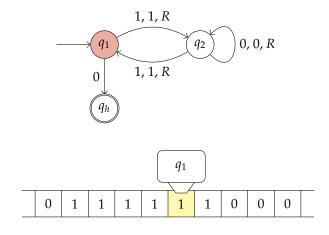
Turing Machines: What is a Function? (cont'd)

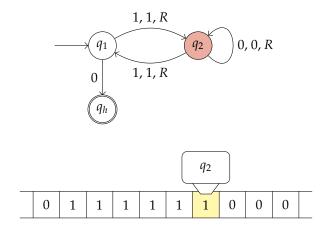


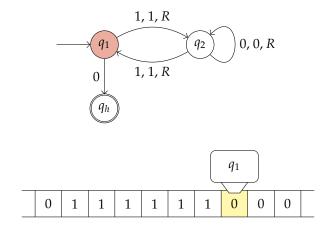




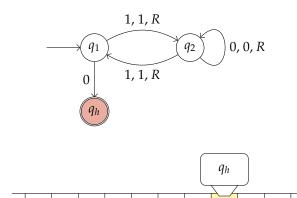








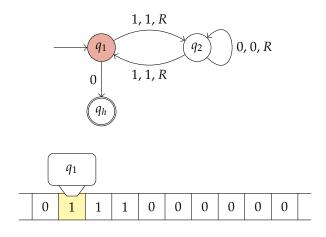
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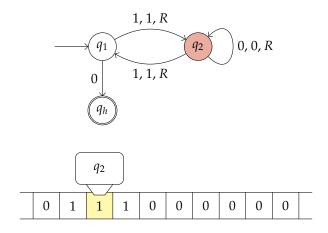


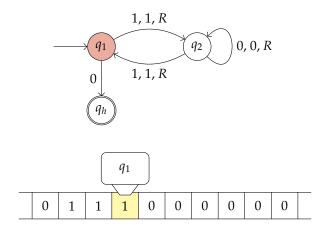
t = 7

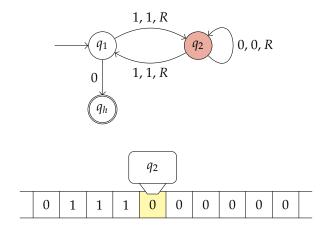
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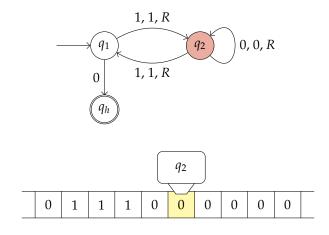
0 0

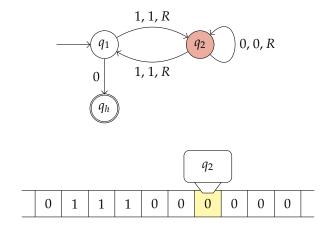


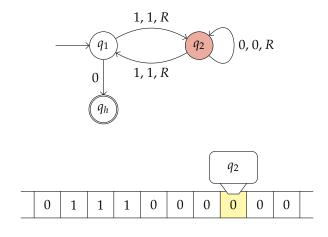


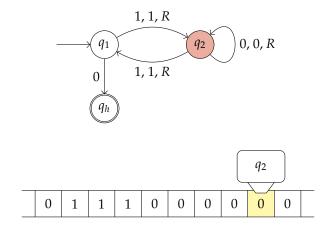




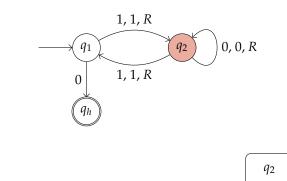








0

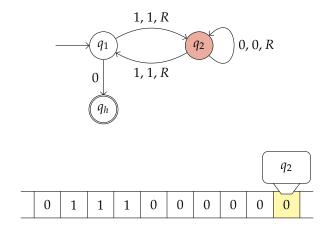


0 0 0

0

0

0



t = 8

Some Turing machines, depending on the input, may never halt!

If the Turing machine on the previous slide computes any function, it is the following partial function:

• IsEven<sub>semi</sub>: 
$$n \mapsto \begin{cases} n & \text{if } n \text{ is even,} \\ \text{undefined} & \text{if } n \text{ is odd.} \end{cases}$$

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Thus, some Turing machines may fail to compute total functions. But we regard every Turing machine as computing some function or other, so we enter

**Definition.** We say that a partial function is **Turing computable** to mean that there is a Turing machine that computes it (or that can be interpreted as computing it . . .).

# Turing Machines: What Turing Machines Can Do

Many functions can be obtained by composing others: e.g.,

$$(m,n)\mapsto 2(m+n)$$

is the composition of

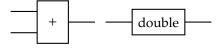
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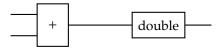


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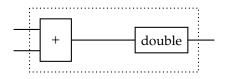


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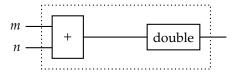


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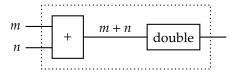


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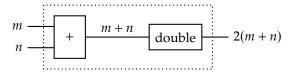


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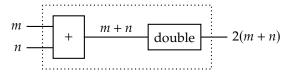
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We write  $g \circ f$  for the composition "first f and then g" (because  $g \circ f(m, n) = g(f(m, n))$ ).

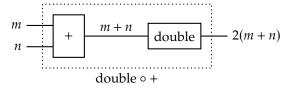
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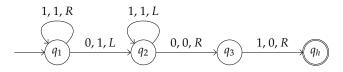
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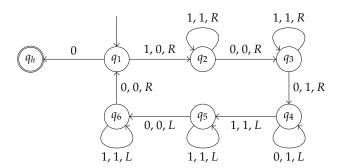


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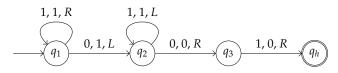
#### + is computed by

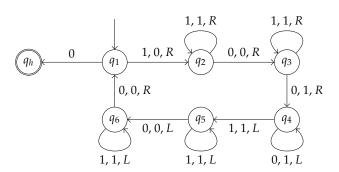


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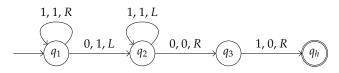


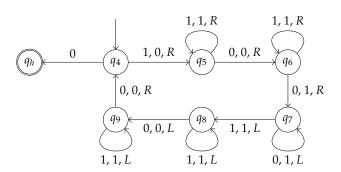
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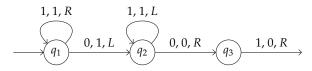


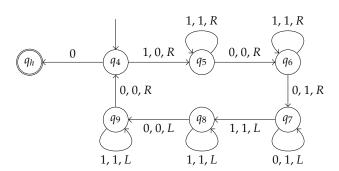
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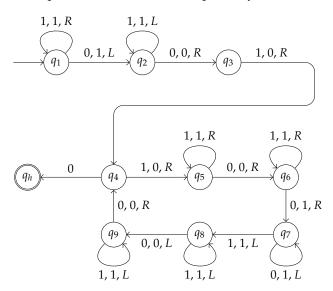


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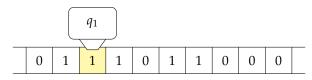


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# Coding and a universal Turing machine.

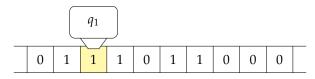
The state of a Turing machine and a tape combined



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### Coding and a universal Turing machine.

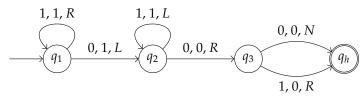
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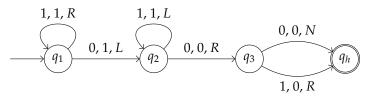
can be represented by

$$1q_111011$$

(called a "complete configuration" or "instantaneous description").

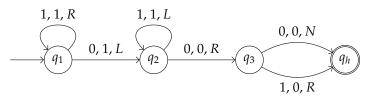


but can also be represented by



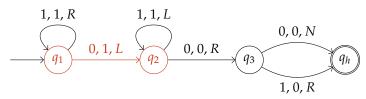
but can also be represented by

	0	1
$\overline{q_1}$	$1, L, q_2$	$1, R, q_1$
$q_2$	$0, R, q_3$	$1,L,q_2$
$q_3$		$0, R, q_h$



but can also be represented by

or ;  $q_101Lq_2$ ;  $q_111Rq_1$ ;  $q_200Rq_3$ ;  $q_211Lq_2$ ;  $q_300Lq_h$ ;  $q_310Rq_h$ 



but can also be represented by

$$\begin{vmatrix} 0 & 1 \\ q_1 & 1, L, q_2 & 1, R, q_1 \\ q_2 & 0, R, q_3 & 1, L, q_2 \\ q_3 & 0, N, q_h & 0, R, q_h \end{vmatrix}$$

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Now let's take another look at https://turingmachine.io/

More precisely, it takes in two inputs,

- **1** a code representing a Turing machine *M*,
- ② a code representing an input *x* for Turing machines, and outputs the result of feeding *x* to *M*.

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Turing's idea: There is a Turing machine that can do this!

**Definition.** A "universal Turing machine" is a Turing machine that does the computation above — i.e., that takes in a combination of a code of a Turing machine M and another input x as input, and outputs the result of feeding x to M.

E.g., feed it with codes of

;  $q_101Lq_2$ ;  $q_111Rq_1$ ;  $q_200Rq_3$ ;  $q_211Lq_2$ ;  $q_300Lq_h$ ;  $q_310Rq_h$  and  $q_1111011$ ; then it outputs 11111.

Now let's get back to this:

**Definition.** We say that a function is "Turing computable" to mean that there is a Turing machine that computes it.

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Turing computable ← a universal Turing machine can compute it.

It seems correct to say that anything Turing computable is computed mechanically or effectively. How about the converse? Does it hold?

"Yes" is called the Church-Turing thesis:

Any mechanical / effective method can be carried out by some Turing machine, and therefore by the universal Turing machine.

# Turing Machines: What Turing Machines Cannot Do

### **Advice**

We are going to see the first technical "theorem" of this course.

- Its content may be relevant to the final (true / false) exam.
- Its proof may be tough, but do not worry too much: you will not be tested for the understanding of the proof.

But it will be nice to understand the proof. If you find it hard and want my help to understand it,

• Come to see me in office hours & appointments!

# Uncomputable numbers.

There are (even mathematical) things Turing computers cannot do . . . .

### Uncomputable numbers.

There are (even mathematical) things Turing computers cannot do ....

**Definition.** A real number x is called computable if there is a computable function  $f : \mathbb{N} \to \mathbb{Z}$  that approximates it, in the sense that

$$\frac{f(n)}{10^n} = x \text{ rounded down to } n \text{ decimal places.}$$

E.g.,  $\pi$  is computable: there is a Turing computable function f s.th.

$$f(0) = 3$$
,  $f(2) = 314$ ,  $f(10) = 31415926535$ , etc., i.e.,  $\frac{f(0)}{10^0} = 3$ ,  $\frac{f(2)}{10^2} = 3.14$ ,  $\frac{f(10)}{10^{10}} = 3.1415926535$ , etc.

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But the overwhelming majority of real numbers are not computable.

Proof. Remember that we can code all the Turing machines; let's code them by natural numbers. Then we can order all the Turing machines by comparing their natural-number codes.

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Then write  $x_{n,0}$  for the integer part of  $x_n$  and  $x_{n,m}$  (m > 0) for the digit in the mth decimal place of  $x_n$ . Visually, we have the following table:

	0	1	2	3	• • • •
$x_0$	$x_{0,0}$	$x_{0,1}$	$x_{0,2}$	$x_{0,3}$	
$x_1$	$x_{1,0}$	$x_{1,1}$	$x_{1,2}$	$x_{1,3}$	• • •
$x_2$	$x_{2,0}$	$x_{2,1}$	$x_{2,2}$	$x_{2,3}$	• • •
$x_3$	$x_{3,0}$	$x_{3,1}$	$x_{3,2}$	$x_{3,3}$	• • •
:	:	:	:	:	٠.

	0	1	2	3	• • •
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$x_1$	$x_{1,0}$	$x_{1,1}$	$x_{1,2}$	$x_{1,3}$	
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Now define a real number *d* with the integer part  $d_0 = x_{0,0} + 1$  and

$$d_{m} = \begin{cases} x_{m,m} + 1 & \text{if } x_{m,m} = 0, \\ x_{m,m} - 1 & \text{if } 1 \le x_{m,m} \le 9 \end{cases}$$

in the *m*th decimal place.

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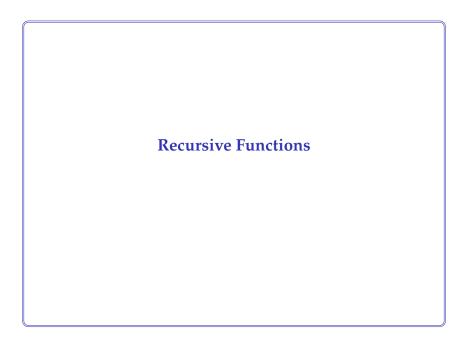
in the mth decimal place. Then d differs from every  $x_n$ , because  $d_n \neq x_{n,n}$  (and because d has no 9 in any decimal place).

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in the mth decimal place. Then d differs from every  $x_n$ , because  $d_n \neq x_{n,n}$  (and because d has no 9 in any decimal place). Therefore d is not Turing computable.



#### **Advice**

This is a technical part of the course that will be covered in the technical exercises and the midterm exam.

If anything here does not "click" in your mind,

• Come to see me in office hours & appointments!

You are only expected to learn what the rule of the game is like. It is absolutely natural if it does not "click" in your mind for the first time you see it. But to resolve that situation, you need interactive help. Please, please help me help you.

In particular, "What functions of natural numbers are computable?"

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E.g., we have seen Turing machines compute:

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But then we know the following are Turing computable, too:

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We start from simple, obviously computable functions, and show more complicated ones to be computable, by showing that they can be built from simple ones by simple operations (e.g. composition).

## The Basic Six

So what functions would be obviously computable?

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• The zero:

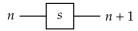


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• The successor:



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$$n \longrightarrow n$$

• The identity:

So what functions would be obviously computable?

• The zero:

• The successor:

$$n \longrightarrow s \longrightarrow n+1$$

• The discarding:

$$n \longrightarrow |1$$

• The duplication:

$$n \longrightarrow n$$

• The identity:

n — \_ \_ r

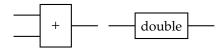
• The swap:



Boxes can be composed both serially and parallelly.

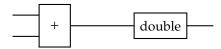
Boxes can be composed both serially and parallelly.

E.g.,



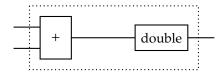
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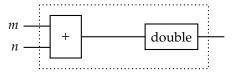
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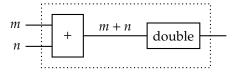
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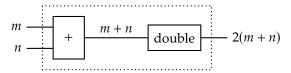
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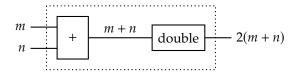
E.g.,

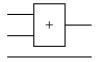


Boxes can be composed both serially and parallelly.

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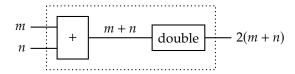


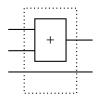


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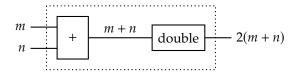


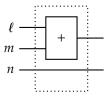


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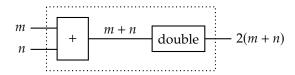


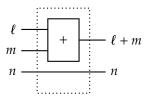


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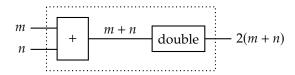


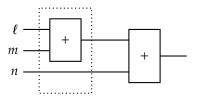


Boxes can be composed both serially and parallelly.

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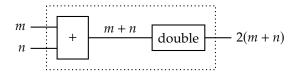


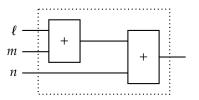


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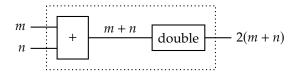


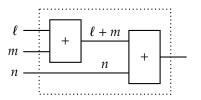


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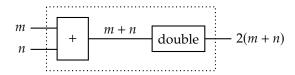


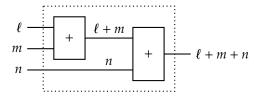


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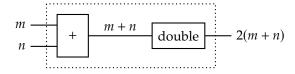




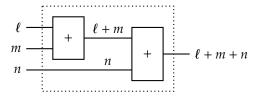
Boxes can be composed both serially and parallelly.

#### E.g.,

•



•



If parts are computable so is their composition!

• The number 4 (i.e. the function that takes no input and outputs 4) is computable because it can be built as

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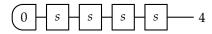


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Indeed, every natural number (as a function) is computable.

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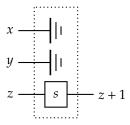


Indeed, every natural number (as a function) is computable.

The function

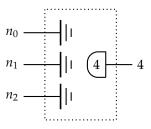
$$g:(x,y,z)\mapsto z+1$$

is computable because it can be built as

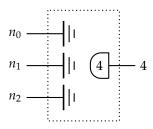


• The constant function  $4: \mathbb{N}^3 \to \mathbb{N}: (n_0, \dots, n_2) \mapsto 4$  is computable because it can be built as

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Indeed, every constant function  $n : \mathbb{N}^k \to \mathbb{N} :: (n_0, \dots, n_{k-1}) \mapsto n$  is computable.

So how powerful is composition? Can it create a lot of functions?

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— No, not really. It cannot even create + or  $\times$ .

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— No, not really. It cannot even create + or  $\times$ .

Our next order of business is to introduce another way of constructing new functions, and to use it to create + or  $\times$ .