

# CS 7220 – Computational Complexity and Algorithm Analysis

Spring 2016

Section 7: Computability – Part II  
Turing Computable Functions

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Chapter 9 of [Sudkamp 2006].

1. **Computation of Functions**
2. Numeric Computation
3. Sequential Operation of TMs
4. Composition of Functions
5. Uncomputable Functions

# Functions



A function  $f: X \rightarrow Y$  is an assignment, to each  $x \in X$ , of *at most one* value in  $Y$ . (Mathematicians call these: *partial* functions.)

$X$  ... domain of  $f$

$Y$  ... range of  $f$

We write  $f(x) \uparrow$  (or  $f(x) = \uparrow$ ) if no value is assigned to  $f(x)$ , and say  $f(x)$  is undefined.

We write  $f(x) \downarrow$  if  $f(x)$  is defined (we're not giving the value in this case).

If  $f(x) \downarrow$  for all  $x \in X$ , we say that  $f$  is a *total* function.

# TMs for computing functions



TMs for computing functions have

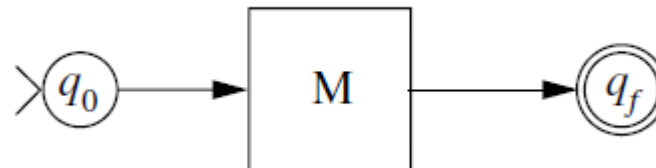
- Two distinguished states
  - The initial state  $q_0$
  - The final state  $q_f$
- Input is positioned as usual
- Computation always begins with transition from  $q_0$  that positions the tape head at the beginning of the input string.
- The initial state is never reentered (there is no transition into  $q_0$ ).
- All computations with output terminate in  $q_f$  and with tape head in initial position
- There is no transition of the form  $\pm(q_f, B)$
- Output is given in the same position as the input
- The computation does not terminate on input  $u$  with  $f(u) \uparrow$
- The computation yields output  $v$  if and only if  $f(u)=v$ .

# Turing computability



A function  $f: \Sigma^* \rightarrow \Sigma^*$  is Turing computable if there is a TM that computes it.

We may depict such a TM schematically as

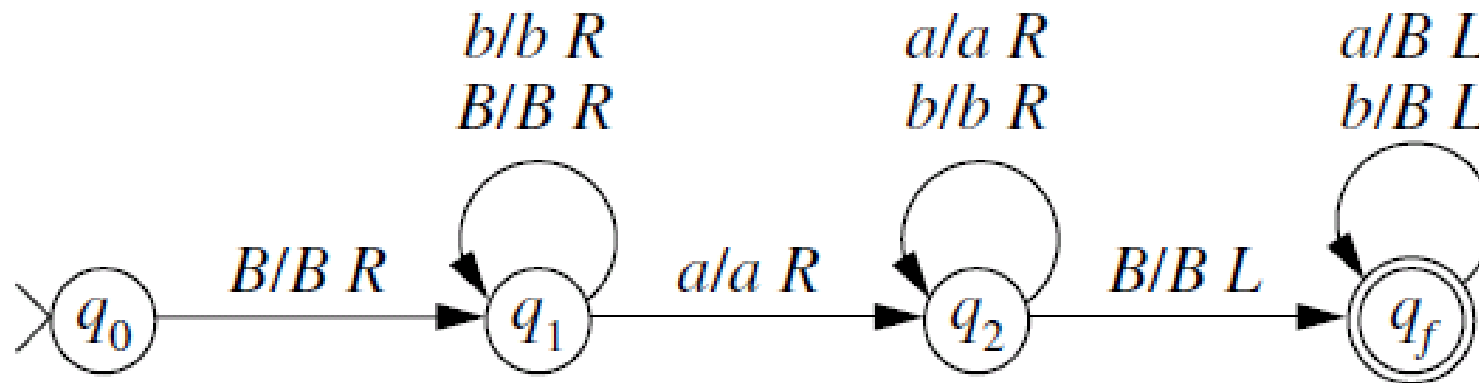


# Example 2.1

TM computing  $f:\{a,b\}^* \rightarrow \{a,b\}^*$  defined as

$f(u) = \lambda$ , if  $u$  contains an  $a$  ( $\lambda$  denotes the empty word)

$f(u) = \uparrow$ , otherwise



**Note:** on undefined input (say,  $BbBbBaB$ ) we may still get some “output” (e.g.,  $BbBbq_fB$ ).

# Exercise C3



Make a TM which computes the function

$$\begin{aligned} f(n) &= n/2 && \text{(n divided by 2) if n is a multiple of 2} \\ f(n) &= \uparrow && \text{if n is not a multiple of 2} \end{aligned}$$

where the input and output strings are non-negative integers in binary representation.

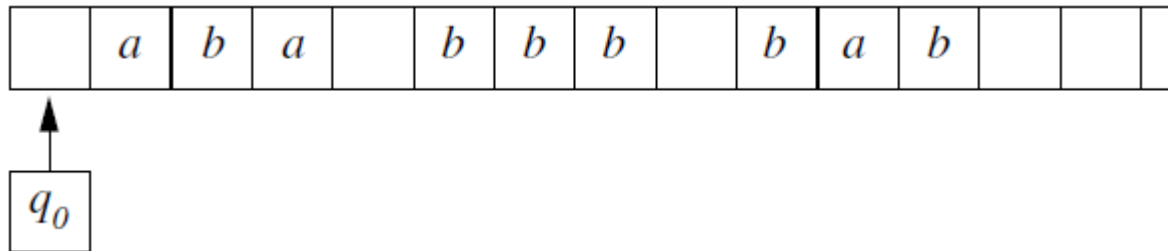
Describe, in words, the strategy of your TM.

# Multiple parameters

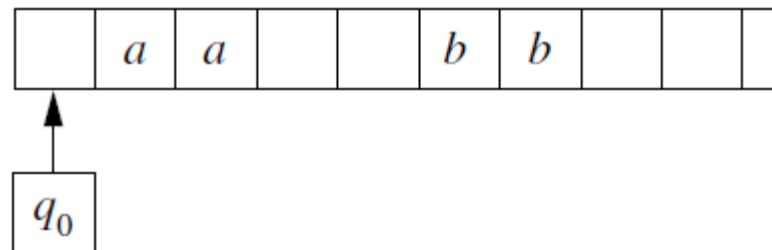


The input for functions with more than one argument is given by blank-separated strings, in the sequence of the arguments.

E.g., input (aba,bbb,bab) is given as

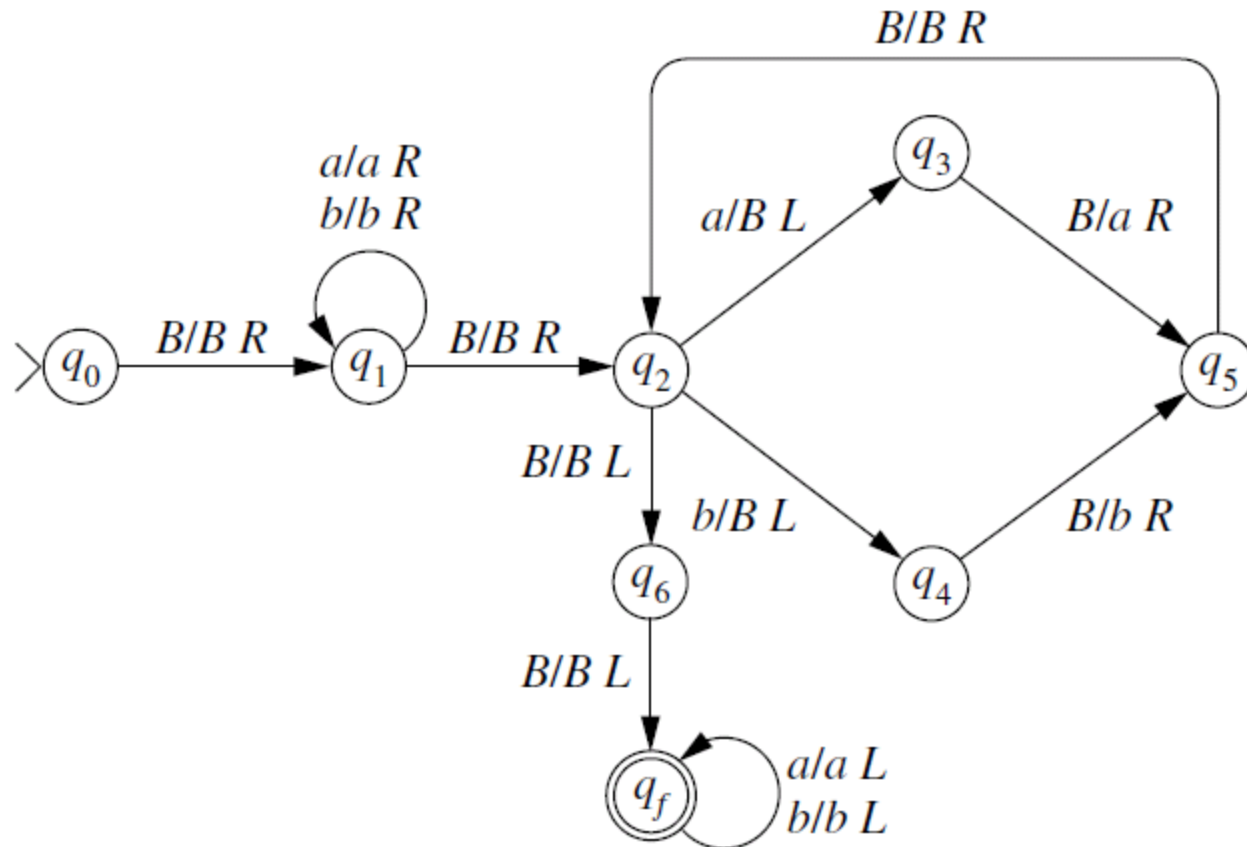


Input (aa, $\lambda$ ,bb) is given as





# Example 2.2: String concatenation



# Characteristic functions



The *characteristic function* of a language  $L$  is the function

$c_L: \Sigma^* \rightarrow \{0,1\}$  defined by

$$c_L(u) = 1 \text{ if } u \in L$$

$$c_L(u) = 0 \text{ if } u \notin L$$

**Note:** A TM that computes the partial characteristic function

$$c_L(u) = 1 \quad \text{if } u \in L$$

$$c_L(u) = 0 \text{ or } \uparrow \quad \text{if } u \notin L$$

shows that  $L$  is recursively enumerable.

# Exercise C4



**Show for every language  $L$ : if there is a TM that computes the partial characteristic function of  $L$ , then  $L$  is recursively enumerable.**

## Exercise C5



Show that, for each recursively enumerable language  $L$ , there exists a TM which computes the partial characteristic function of  $L$ .

# Exercise C6 [hand-in]



**Show that a language  $L$  is recursive if and only if its (total) characteristic function is Turing computable.**

# TOC: Turing Computable Functions



Chapter 9 of [Sudkamp 2006].

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# Number-theoretic functions



A *number-theoretic function* is a function of the form

$$F: \mathbb{N} \times \mathbb{N} \times \dots \times \mathbb{N} \rightarrow \mathbb{N},$$

where  $\mathbb{N}$  is the set of non-negative integers.

For computing number-theoretic functions by TMs, we assume that non-negative integers are represented by strings of “1” symbols. More precisely, the number  $n$  is represented by a string with  $(n+1)$  consecutive “1”s. We call this *the unary representation* of numbers.

E.g., “5” is represented as “11111”. “0” is represented as “1”.

For a number  $a$ , we write its unary representation as  $\bar{a}$ .

# Characteristic functions



A  $k$ -variable total number-theoretic function

$$r: \mathbb{N} \times \mathbb{N} \times \dots \times \mathbb{N} \rightarrow \{0, 1\}$$

defines a  $k$ -ary relation  $R$  on the domain of the function:

$$\begin{aligned} (n_1, \dots, n_k) \in R & \quad \text{if } r(n_1, \dots, n_k) = 1 \\ (n_1, \dots, n_k) \notin R & \quad \text{if } r(n_1, \dots, n_k) = 0 \end{aligned}$$

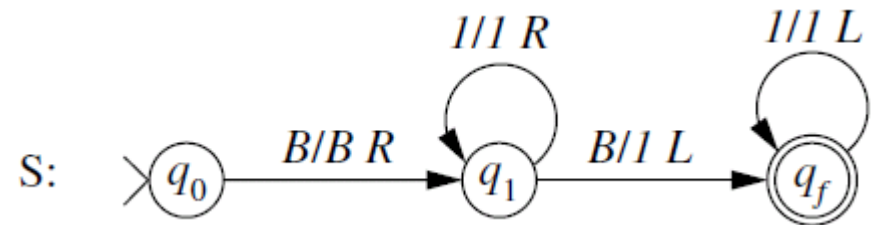
$r$  is the *characteristic function* of  $R$ .

We define: A relation is Turing computable if its characteristic function is Turing computable.

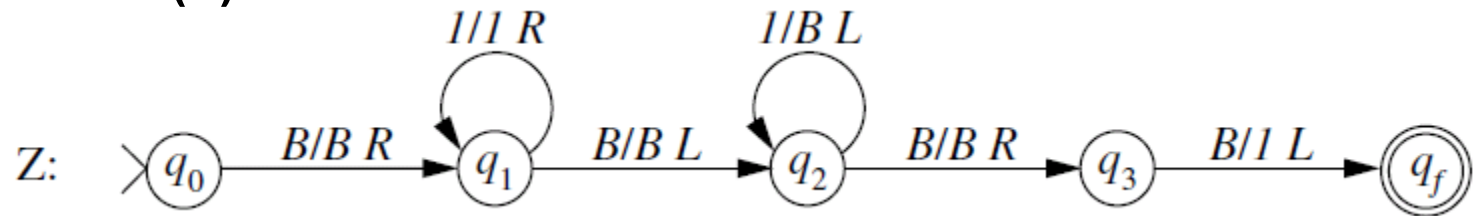


# Some TMs for number-theoret. fctns

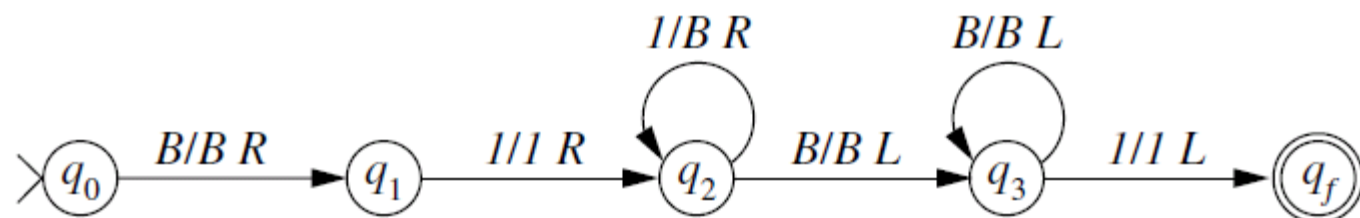
- Successor function  $s(n) = n+1$



- Zero function  $z(n) = 0$

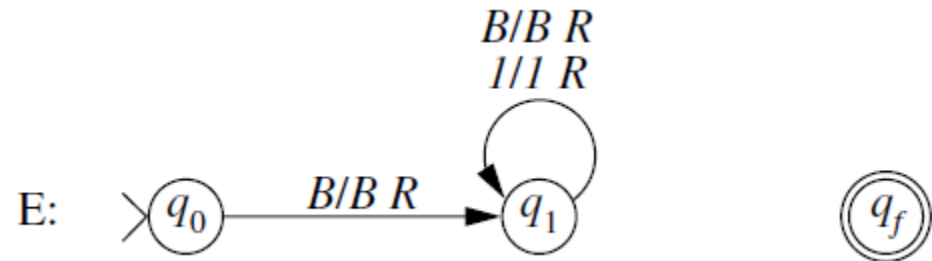


Alternatively:

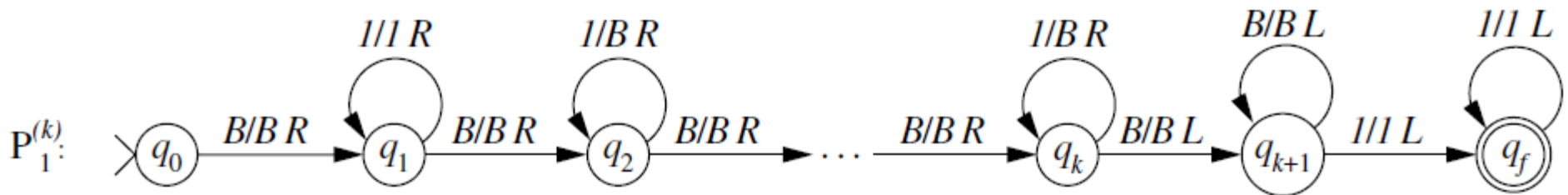


# Some TMs for number-theoret. fctns

- Empty function  $e(n) = \uparrow$

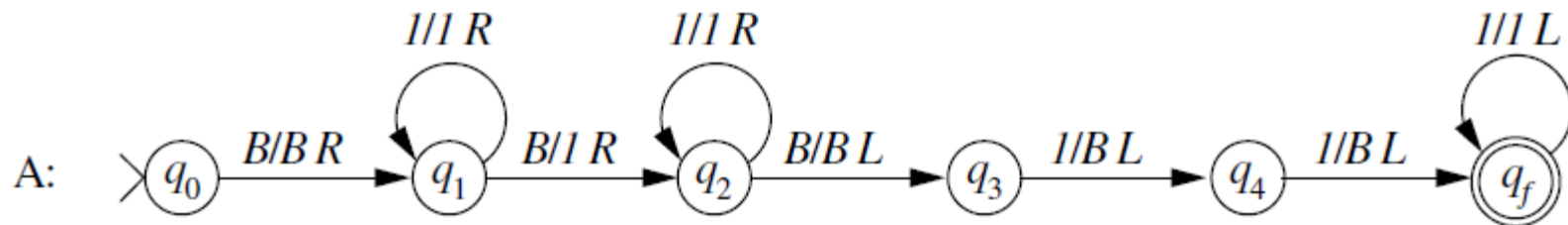


- Projection  $p_i^{(k)}$  defined as  $p_i^{(k)}(n_1, \dots, n_k) = n_i$   
We give the TM for  $p_1^{(k)}$ :

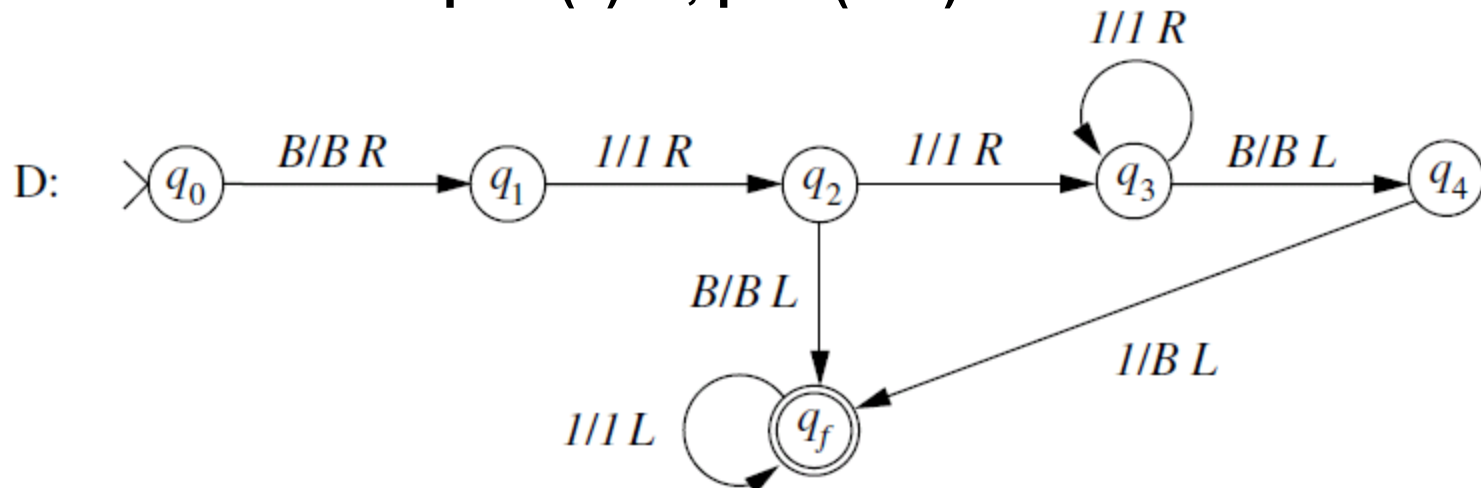


# Some TMs for number-theoret. fctns

- **Binary addition:**



- **Predecessor function:  $\text{pred}(0)=0$ ;  $\text{pred}(n+1)=n$**



# TOC: Turing Computable Functions



Chapter 9 of [Sudkamp 2006].

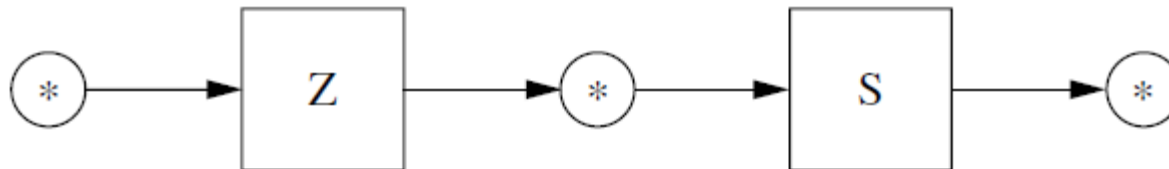
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# Sequential composition



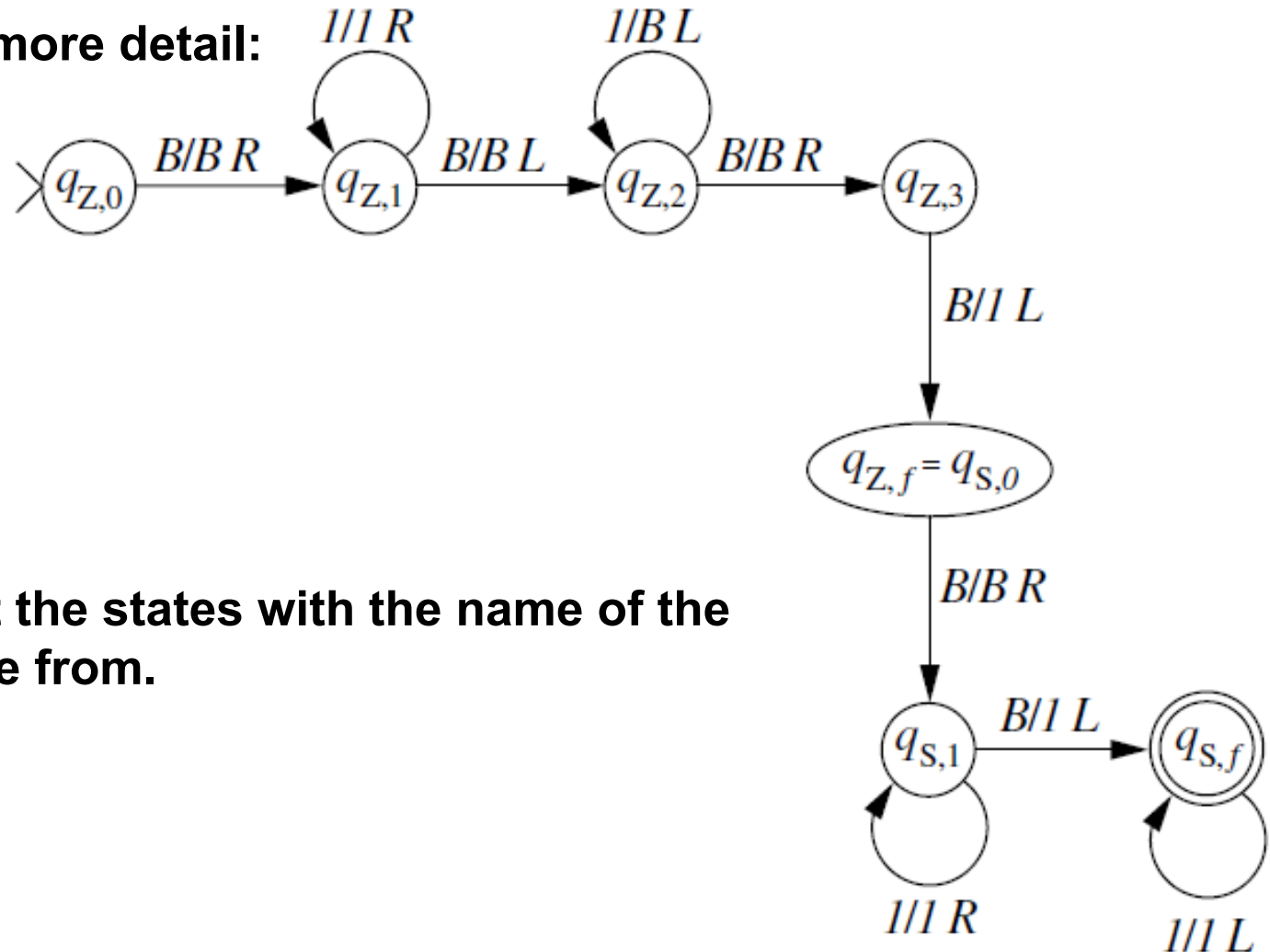
- E.g., first run “zero” TM, then run “successor” TM  
Result: Put value “one” on tape.

- Schematically:



# Sequential composition

- “one” TM in more detail:

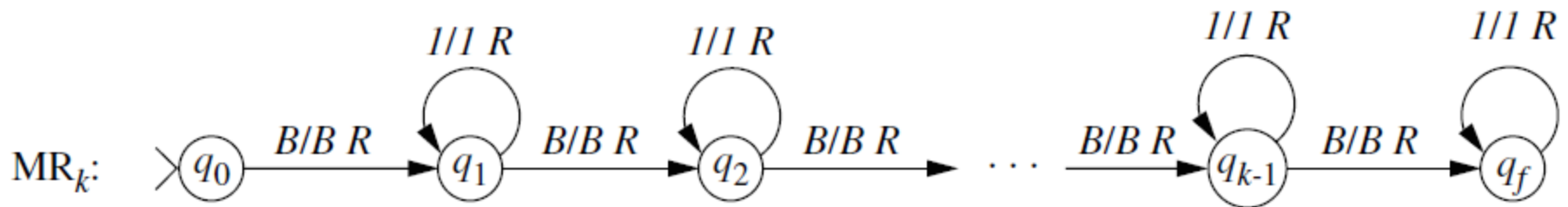
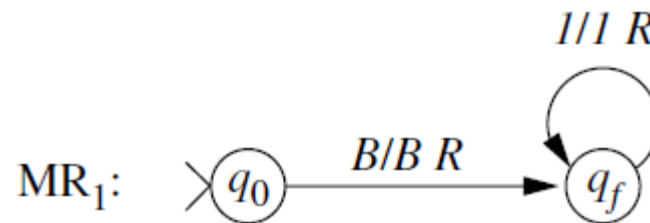


We subscript the states with the name of the TM they come from.

- We call a machine constructed to perform a single simple task a *macro*.
- Conditions on TMs for computing functions are slightly relaxed
  - Computation does not necessarily start with tape head at position zero.
  - First tape symbol read must be a blank.
  - Input to be found to the immediate left or right of the starting position.
  - There may be several halting states in which a computation may terminate.
  - There are no transitions away from any halting state.

# Macros – Examples

- Move head right through several consecutive natural numbers .





# Macros – Examples



- **Macros can also be described by their effect on the tape.**  
**Tape head location: underscore**

$ML_k$  (move left):

$$\begin{array}{ccc} B\bar{n}_1 B\bar{n}_2 B \dots B\bar{n}_k \underline{B} & & k \geq 0 \\ \updownarrow & & \updownarrow \\ \underline{B}\bar{n}_1 B\bar{n}_2 B \dots B\bar{n}_k B & & \end{array}$$

FR (find right):

$$\begin{array}{ccc} \underline{B} B^i \bar{n} B & & i \geq 0 \\ \updownarrow & \updownarrow & \\ B^i \underline{B} \bar{n} B & & \end{array}$$

# Macros – Examples



FL (find left):

$$\begin{array}{c} B\bar{n}B^i\underline{B} \quad i \geq 0 \\ \updownarrow \quad \updownarrow \\ \underline{B}\bar{n}B^i B \end{array}$$

$E_k$  (erase):

$$\begin{array}{c} \underline{B}\bar{n}_1 B\bar{n}_2 B \dots B\bar{n}_k B \quad k \geq 1 \\ \updownarrow \quad \quad \quad \updownarrow \\ \underline{B}B \quad \dots \quad BB \end{array}$$

# Macros – Examples



CPY<sub>k</sub> (copy):

$$\begin{array}{ccccccc} \underline{B\bar{n}}_1 B\bar{n}_2 B \dots B\bar{n}_k B B B & \dots & B B & k \geq 1 \\ \updownarrow & & \updownarrow & \\ \underline{B\bar{n}}_1 B\bar{n}_2 B \dots B\bar{n}_k B\bar{n}_1 B\bar{n}_2 B \dots B\bar{n}_k B \end{array}$$

CPY<sub>k,i</sub> (copy through *i* numbers):

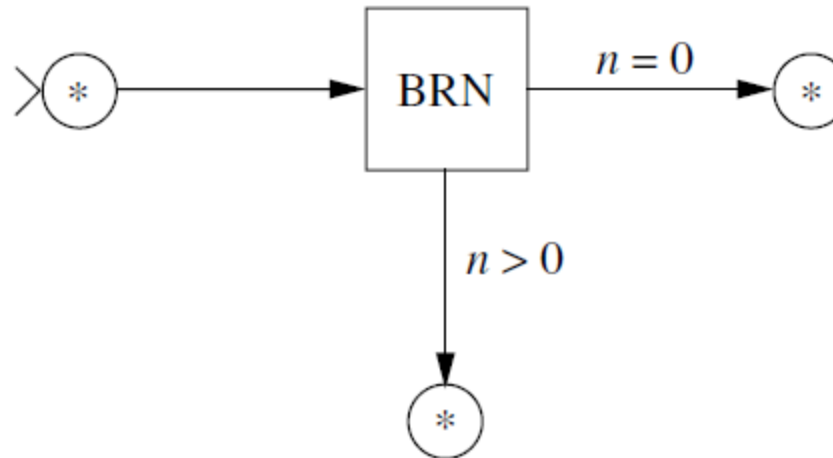
$$\begin{array}{ccccccc} \underline{B\bar{n}}_1 B\bar{n}_2 B \dots B\bar{n}_k B\bar{n}_{k+1} \dots B\bar{n}_{k+i} B B & \dots & B B & k \geq 1 \\ \updownarrow & & \updownarrow & \\ \underline{B\bar{n}}_1 B\bar{n}_2 B \dots B\bar{n}_k B\bar{n}_{k+1} \dots B\bar{n}_{k+i} B\bar{n}_1 B\bar{n}_2 B \dots B\bar{n}_k B \end{array}$$

# Macros – Examples

T (translate):

$$\begin{array}{ccc} \underline{B}B^i\bar{n}B & & i \geq 0 \\ \updownarrow & & \updownarrow \\ \underline{B}\bar{n}B^iB & & \end{array}$$

BRN (branch on zero):



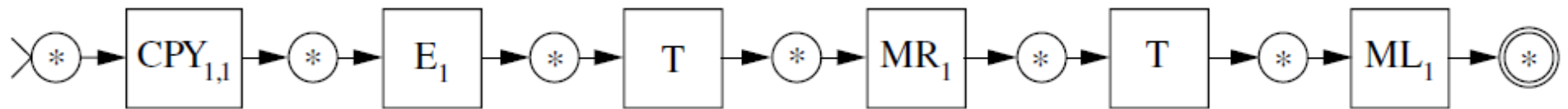
# Exercise C7



Give a TM for the BRN macro.

# Macro composition

INT:



Interchanges the order of two numbers:

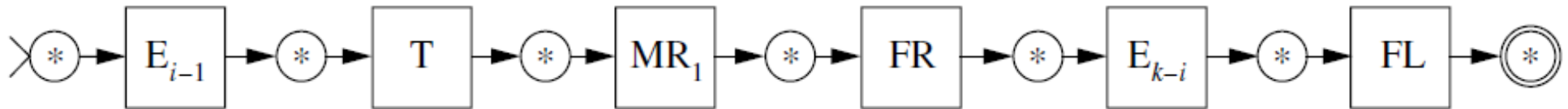
$$\underline{B\bar{n}}B\bar{m}BB^{n+1}B$$

$$\updownarrow \qquad \updownarrow$$

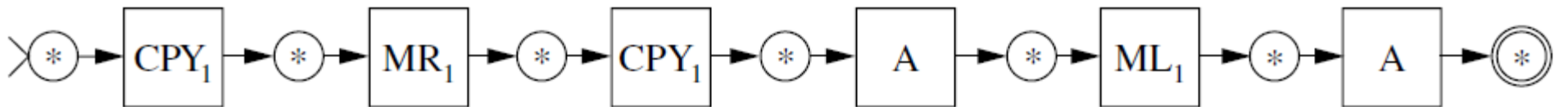
$$\underline{B\bar{m}}B\bar{n}BB^{n+1}B$$

# Examples 2.3 and 2.4

- Projection function  $p_i^{(k)}$

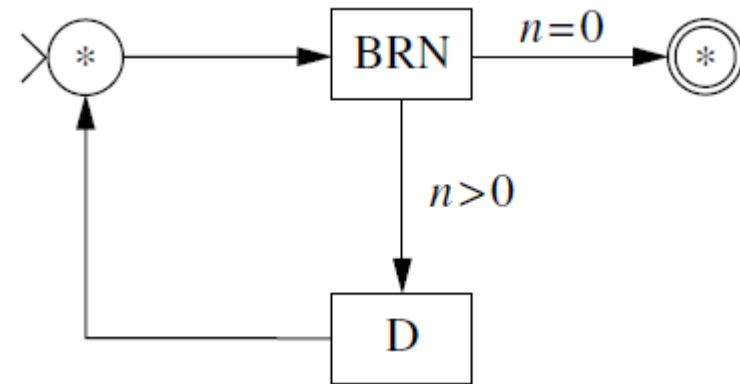


- $f(n) = 3n$



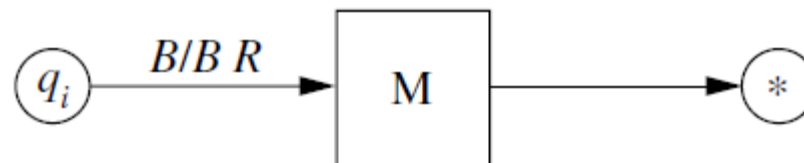
# Examples 2.5 and 2.6

- One-variable zero function  $z(n) = 0$

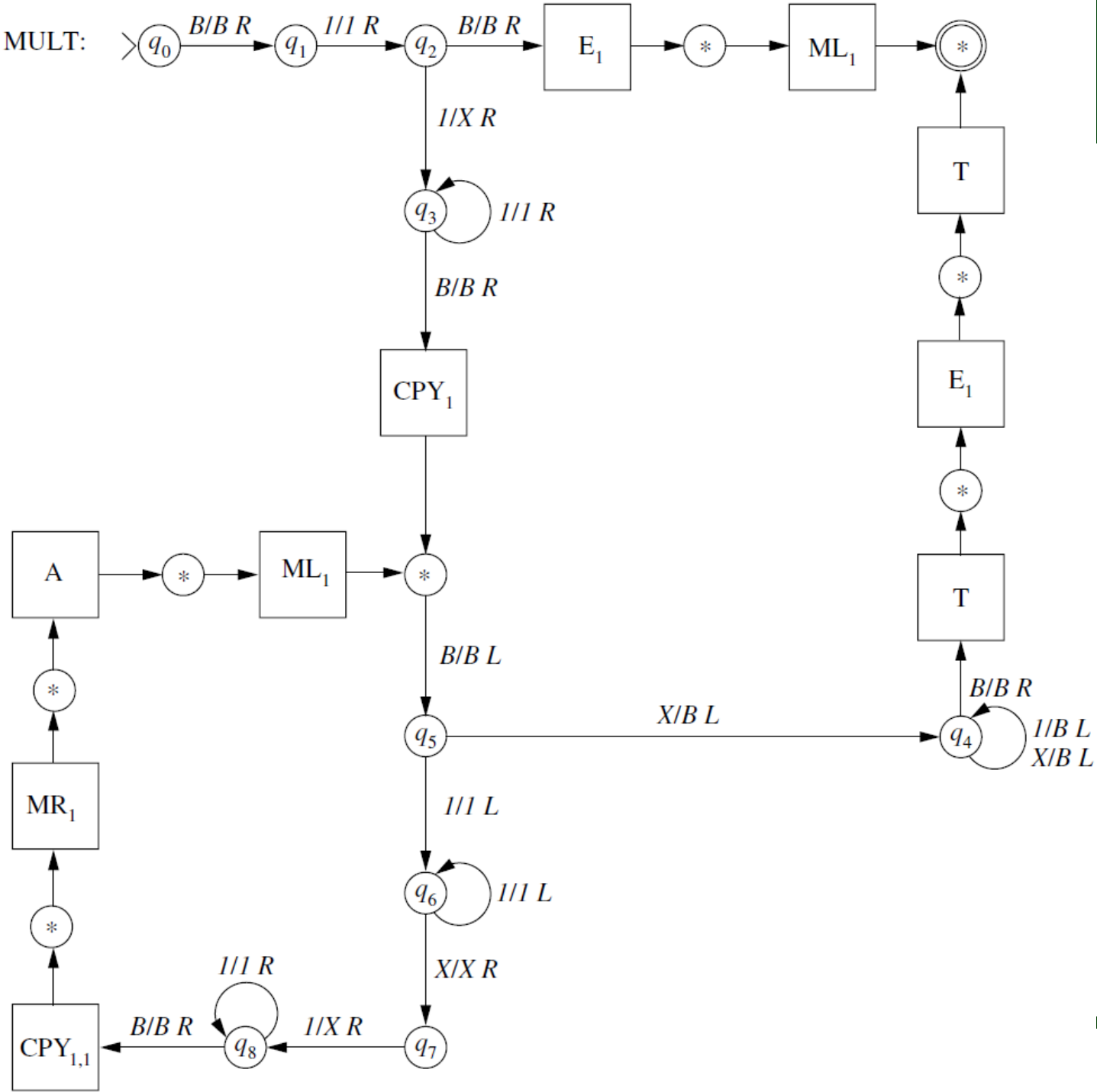


- MULT (multiplication of natural numbers):

We need to mix macros with standard TM transitions for this. Schematically, e.g. identify macro start state with  $q_i$ :







# TOC: Turing Computable Functions



Chapter 9 of [Sudkamp 2006].

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# Composition of unary functions



Let  $g, h$  be unary number-theoretic functions.

*The composition of  $g$  with  $h$* , written  $h \circ g$ , is the unary function  $f: \mathbb{N} \rightarrow \mathbb{N}$  defined by

$$f(x) = \begin{cases} \uparrow & \text{if } g(x) \uparrow \\ \uparrow & \text{if } g(x) = y \text{ and } h(y) \uparrow \\ h(y) & \text{if } g(x) = y \text{ and } h(y) \downarrow \end{cases}$$

**Note  $h \circ g(x) = h(g(x))$  – which is defined whenever  $g(x)$  is defined and  $h(y)$  is defined for  $y=g(x)$ .**

# Composition of n-ary functions



Let  $g_1, \dots, g_n$  be  $k$ -ary number-theoretic functions.

Let  $h$  be an  $n$ -ary number-theoretic function.

The  $k$ -ary function  $f$  defined by

$$F(x_1, \dots, x_k) = h( g_1(x_1, \dots, x_k), \dots, g_n(x_1, \dots, x_k) )$$

is called the *composition* of  $h$  with  $g_1, \dots, g_n$ , written

$$f = h \circ (g_1, \dots, g_n).$$

## Example 2.7



Let the following functions be defined as indicated:

$$g_1(x,y) = x+y$$

$$g_2(x,y) = xy$$

$$g_3(x,y) = x^y$$

$$h(x,y,z) = x (y+z)$$

Then  $f(x,y) = h \circ (g_1, g_2, g_3) = (x+y)(xy+x^y)$ .

# Composition by TMs



Assume we have

$g_1$ , a ternary function computed by the TM  $G_1$

$g_2$ , a ternary function computed by the TM  $G_2$

$h$ , a binary function computed by the TM  $H$

$h \circ (g_1, g_2)$  is computed by a TM as follows – we give a trace on input  $n_1, n_2, n_3$ .

# Trace – composition example



	$\underline{B\bar{n}_1 B\bar{n}_2 B\bar{n}_3} B$
CPY <sub>3</sub>	$\underline{B\bar{n}_1 B\bar{n}_2 B\bar{n}_3 B\bar{n}_1 B\bar{n}_2 B\bar{n}_3} B$
MR <sub>3</sub>	$\underline{B\bar{n}_1 B\bar{n}_2 B\bar{n}_3} \underline{B\bar{n}_1 B\bar{n}_2 B\bar{n}_3} B$
G <sub>1</sub>	$\underline{B\bar{n}_1 B\bar{n}_2 B\bar{n}_3} \underline{B g_1(n_1, n_2, n_3)} B$
ML <sub>3</sub>	$\underline{B\bar{n}_1 B\bar{n}_2 B\bar{n}_3} \underline{B g_1(n_1, n_2, n_3)} B$
CPY <sub>3,1</sub>	$\underline{B\bar{n}_1 B\bar{n}_2 B\bar{n}_3} \underline{B g_1(n_1, n_2, n_3)} \underline{B\bar{n}_1 B\bar{n}_2 B\bar{n}_3} B$
MR <sub>4</sub>	$\underline{B\bar{n}_1 B\bar{n}_2 B\bar{n}_3} \underline{B g_1(n_1, n_2, n_3)} \underline{B\bar{n}_1 B\bar{n}_2 B\bar{n}_3} B$
G <sub>2</sub>	$\underline{B\bar{n}_1 B\bar{n}_2 B\bar{n}_3} \underline{B g_1(n_1, n_2, n_3)} \underline{B g_2(n_1, n_2, n_3)} B$
ML <sub>1</sub>	$\underline{B\bar{n}_1 B\bar{n}_2 B\bar{n}_3} \underline{B g_1(n_1, n_2, n_3)} \underline{B g_2(n_1, n_2, n_3)} B$
H	$\underline{B\bar{n}_1 B\bar{n}_2 B\bar{n}_3} \underline{B h(g_1(n_1, n_2, n_3), g_2(n_1, n_2, n_3))} B$
ML <sub>3</sub>	$\underline{B\bar{n}_1 B\bar{n}_2 B\bar{n}_3} \underline{B h(g_1(n_1, n_2, n_3), g_2(n_1, n_2, n_3))} B$
E <sub>3</sub>	$\underline{B B} \dots \underline{B h(g_1(n_1, n_2, n_3), g_2(n_1, n_2, n_3))} B$
T	$\underline{B h(g_1(n_1, n_2, n_3), g_2(n_1, n_2, n_3))} B$

# Composition of functions by TMs



## Theorem 2.8

**The Turing computable functions are closed under the operation of composition.**

**Proof: skipped.**



## Example 2.9

The binary function (sum-of-squares)

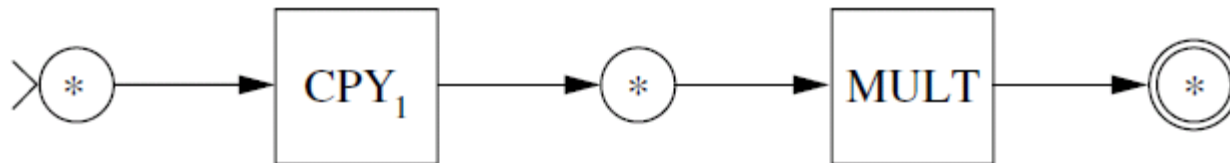
$$\text{smsq}(n,m) = n^2 + m^2$$

is Turing computable.

**Proof:** It can be written as

$$\text{smsq} = \text{add} \circ (\text{sq} \circ p_1^{(2)}, \text{sq} \circ p_2^{(2)}),$$

where  $\text{sq}$  is defined by  $\text{sq}(n) = n^2$ . The function  $\text{add}$  has been shown to be Turing computable earlier. The function  $\text{sq}$  is computed by the following TM:



# Exercise C8



Show that the relation  $\{(n,m) \mid n > m\}$  on non-negative integers is Turing-computable.

## Exercise C9



Let  $F$  be a TM that computes the total unary number-theoretic function  $f$ .

Design a TM that computes the function

$$g(n) = \sum_{i=0}^n f(i).$$

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# Uncomputable functions



## Theorem 2.10

**The set of all Turing computable number-theoretic functions is countable.**

**Proof idea?**

**Note: If a set  $A$  is countable, then any subset of  $A$  is also countable.  
[Enumerate by skipping the elements which are not in the subset.]**

**We already know that the set  $A$  of all Turing Machines is countable.  
Hence, the subset  $B$  of  $A$  of all Turing Machines which compute number-theoretic functions is countable, say as  $M_1, M_2, \dots$ . The function computed by  $M_i$  is denoted  $f(M_i)$ .**

**By definition, for every computable function there is a TM in  $B$  computing it.**

**Define a subset  $C$  of  $B$  as follows:  $M_i$  is in  $C$  if and only if there is no  $M_j$  with  $j > i$  such that  $M_i$  and  $M_j$  compute the same function.**

**$C$  can be enumerated as  $N_1, N_2, \dots$**

**Hence, all computable functions can be enumerated as  $f(N_1), f(N_2), \dots$**

# Uncomputable functions



## Theorem 2.11

**There is a total unary number-theoretic function that is not Turing computable.**

**Proof idea?**

**We show that the set of all a total unary number-theoretic functions is uncountable.**

**Assume it is countable:  $f_1, f_2, \dots$**

**Now define a function by setting  $f(n) = f_n(n) + 1$ .**

**Then  $f$  is a unary number-theoretic function which does not appear in the list. This contradicts the assumption, which, hence, must be wrong.**

**Thus, the set of all total unary number-theoretic functions is uncountable.**