

# Vertiefung Theoretische Informatik

## Advanced Topics in Theoretical Computer Science

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# Acknowledgments

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In preparing this lecture we used slides from the lecture of Bernard Beckert, Theoretische Informatik II (held in Koblenz in 2007/2008;

based on slides by K. Erk and L. Priese and on slides by Christoph Kreitz)

Many thanks!

# Literatur

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## **Book:**

Katrin Erk and Lutz Priese:

Theoretische Informatik: Eine umfassende Einführung.

2. Auflage.

Springer-Verlag.

# Further literature

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- J. Hopcroft, R. Motwani, and J. Ullman (2002).  
Einführung in die Automatentheorie, Formale Sprachen und  
Komplexitätstheorie.  
Pearson.
- G. Vossen and K.-U. Witt (2004).  
Grundkurs Theoretische Informatik.  
Vieweg.
- U. Schöning (1994).  
Theoretische Informatik: kurzgefasst.  
Spektrum-Verlag.
- J. Hromkowitz (2011). Theoretische Informatik  
4. Auflage  
Studium.

# Organisation

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**Lecture:** Viorica Sofronie-Stokkermans

sofronie@uni-koblenz.de

**Sprechstunde:** to be announced

# Organisation

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**Lecture:** Viorica Sofronie-Stokkermans

sofronie@uni-koblenz.de

**Sprechstunde:** to be announced

**Exercise:** Markus Bender

mbender@uni-koblenz.de

# Introduction

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- Details about the lecture
- Motivation
- Contents

# Lecture

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- Webseite: [www.uni-koblenz.de/~sofronie/vertiefung-ti-2013/](http://www.uni-koblenz.de/~sofronie/vertiefung-ti-2013/)
- Time and place:
  - **Lecture** Thursdays, 16:00-18:00, Room F 413
  - **Exercises** Tuesdays: 16:00-18:00, Room E 412

Any change necessary?



# Lecture

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## Exercises:

- Will appear weekly on the website
- Will be discussed in the next exercise session
- You can solve them (possibly also in groups of up to 3 students) and hand in the solutions

# Lecture

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## Exercises:

- Will appear weekly on the website
- Will be discussed in the next exercise session
- You can solve them (possibly also in groups of up to 3 students) and hand in the solutions ... *but you do not have to hand them in*

# Lecture

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## Exams:

- **Klausur:** end of the lecture time.  
Criterion for passing: 50% of the total number of points
- **Nachklausur:** end of the semester (from all the material)  
Criterion for passing: 50% of the total number of points in the Nachklausur.

# Introduction

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# Motivation

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**Theoretical Computer Science** studies fundamental concepts in computer science:

- Problems and their description
- Systems/Automata/Machines which solve problems
- “Solvability” of Problems  
(Computability/Decidability and their limits)
- Difficulty (complexity) of solving problems

# Areas of Theoretical Computer Science

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- Formal Languages
- Automata Theory
- Computability Theory
- Complexity Theory
- (Logic)

# Focus of this lecture

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- Formal Languages
- Automata Theory
- **Computability Theory**
- **Complexity Theory**
- (Logic)

# Importance

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**Why is Theoretical Computer Science important?**



# Importance

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## Why is Theoretical Computer Science important?

### Theoretical Computer Science

- is the “fundament” of computer science
- is important e.g. for:  
algorithm techniques, software engineering, compiler construction
- helps in understanding further topics/lectures in computer science
- does not get “old”
- is fun!

# The pragmatic view

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# The pragmatical view

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Assume you are employed as software designer.

# The pragmatical view

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Assume you are employed as software designer.

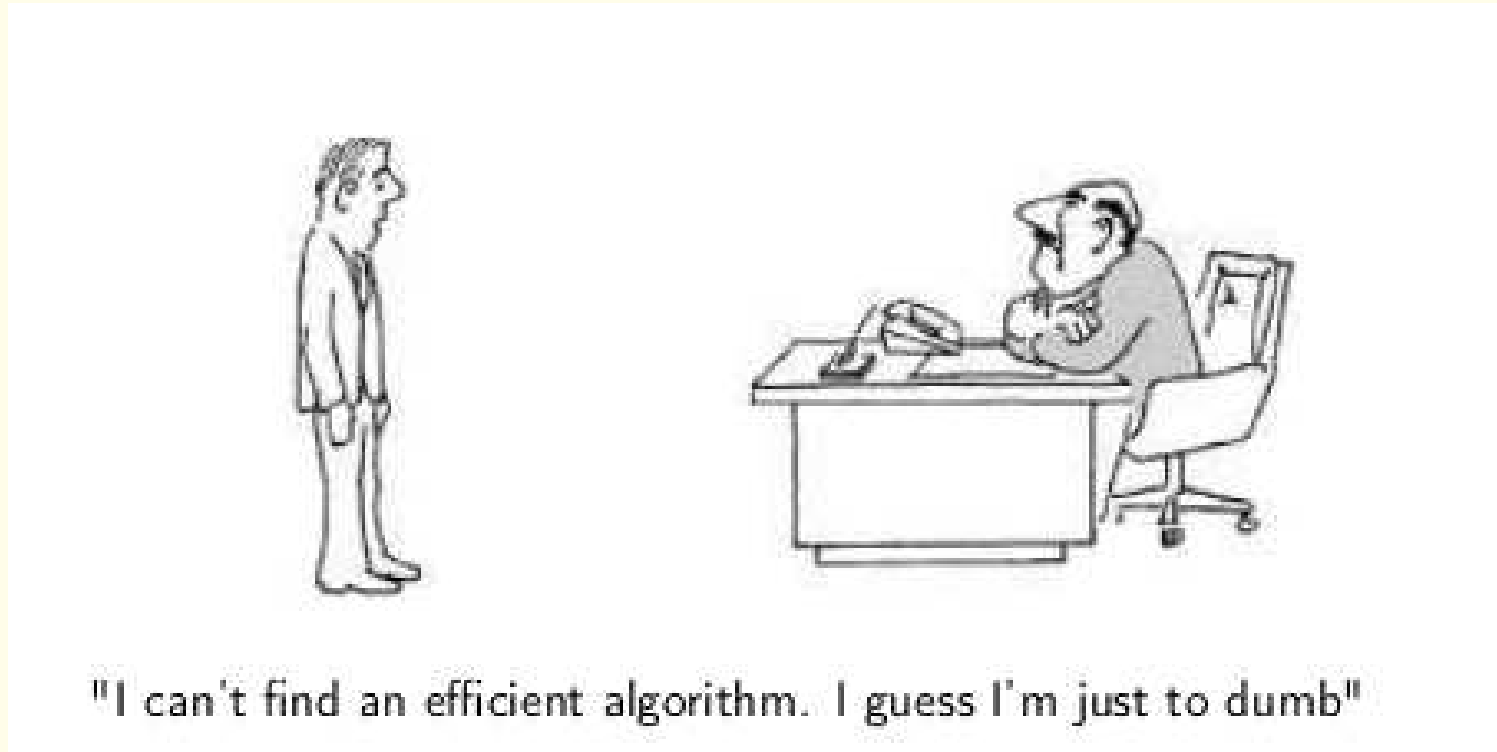
One day, your boss calls you into his office and tells you that the company is about to enter a very competitive market, for which it is essential to know how to solve (efficiently) problem  $X$ .

Your charge is to find an efficient algorithm for solving this problem.

# The pragmatical view

---

What you certainly don't want:



(Garey, Johnson, 1979)

# The pragmatical view

---

It would be much better if you could prove that problem  $X$  is inherently intractable, i.e. that no algorithm could possibly solve it quickly.

# The pragmatical view

---

Much better:



"I can't find an efficient algorithm, because no such algorithm is possible!"

(Garey, Johnson, 1979)

# The pragmatical view

---

In this lecture we will show for instance how to prove that certain problems do not have a (terminating) algorithmic solution

↳ undecidability results

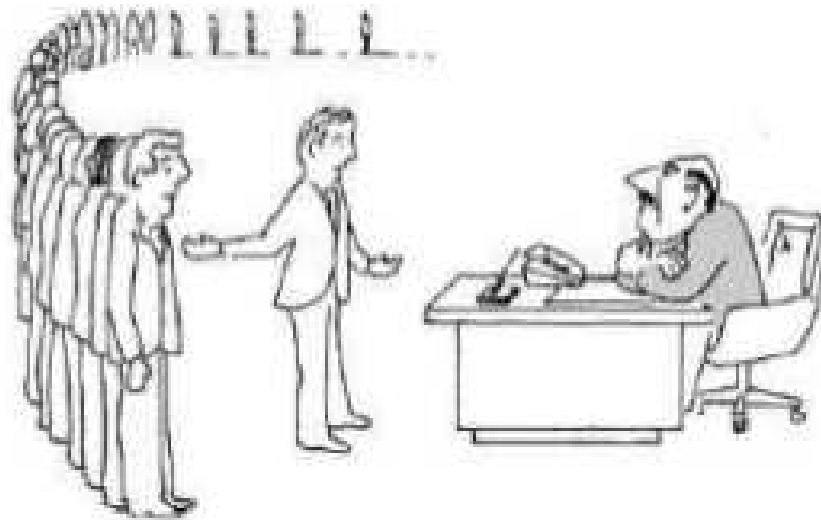
Unfortunately, proving inherent intractability can be just as hard as finding efficient algorithms.



# The pragmatical view

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However, we will see that you can often answer:



"I can't find an efficient algorithm, but neither can all these famous people."

(Garey, Johnson, 1979)

# Contents

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- Recall: Turing machines and Turing computability
- Register machines (LOOP, WHILE, GOTO)
- Recursive functions
- The Church-Turing Thesis
- Computability and (Un-)decidability
- Complexity
- Other computation models: e.g. Büchi Automata

# Contents

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# Computability/Turing Machines: Idea

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# What is a **problem**?

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## Informally:

for certain inputs  
certain **outputs** must be produced.

## More precise definition:

**Input:** Word over alphabet  $\Sigma$

**Output:** Word over alphabet  $\Sigma$

**Problem as relation**  $R \subseteq \Sigma^* \times \Sigma^*$

$(x, y)$  is in  $R$ , if  $y$  is a possible output for input  $x$ .

## Problem as function

Often, for every input there exists a unique output.

In this case, we can represent a problem as a function  $f : \Sigma^* \rightarrow \Sigma^*$ .

The output corresponding to the input  $x \in \Sigma^*$  is  $f(x) \in \Sigma^*$ .

# Decision problems

---

Many problems can be formulated as Yes-No questions.

Such problems have the form:

$$P : \Sigma^* \rightarrow \{\text{Yes, No}\}$$

and are also called decision problems.

## Decision problems vs. Languages

$$\text{Let } L = P^{-1}(\text{Yes}) \subseteq \Sigma^*$$

the set of the inputs answered with “Yes”.

Such a subset is usually called **language**.

# Decision problems

---

Many problems can be formulated as Yes-No questions.

Such problems have the form:

$$P : \Sigma^* \rightarrow \{\text{Yes, No}\}$$

and are also called decision problems.

**Example:**

$$x \in \mathbb{N} \mapsto w \in \{0, 1, \dots, 9\}^*$$

$$P(x) := \begin{cases} \text{Yes} & \text{Prog}(x) \text{ terminates} \\ \text{No} & \text{Prog}(x) \text{ does not terminate} \end{cases}$$

$$L = P^{-1}(\text{Yes}) = \{x \mid x > 100\}$$

## Decision problems vs. Languages

$$\text{Let } L = P^{-1}(\text{Yes}) \subseteq \Sigma^*$$

the set of the inputs answered with “Yes”.

Such a subset is usually called **language**.

Prog(x)

**begin if  $x > 100$  then return  $x$**

**else while true: continue**

**end**

# Central Question

---

Which functions are computable by an algorithm?

resp.

Which problems are decidable by an algorithm?

The motivation to study the decidability and undecidability of problems stems from the mathematician David Hilbert:

At the beginning of the 20th century, he formulated a research plan, (Hilbert's Programme) with the goal of developing a formalism which could allow to solve (algorithmically) all mathematical problems.





# Central Question

---

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To clarify this question from a mathematical point of view, we must clarify what is an algorithm and what is a computer.

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We need a mathematical model of computation

# Central Question

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Which functions are computable by an algorithm?

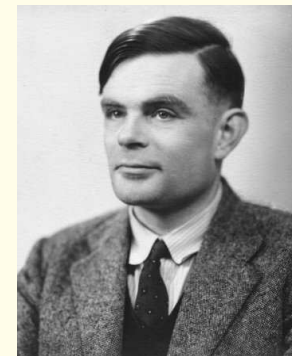
resp.

Which problems are decidable by an algorithm?

To clarify this question from a mathematical point of view, we must clarify what is an algorithm/computer.

We need a mathematical model of computation:

Turing machines



Alan Turing

# Alan Turing

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## Alan Turing (1912 - 1954)

- Mathematician and logician; one of the founders of computer science
- 1936: Introduced “Turing machine” as a model of computability
- 1938: PhD (with Alonzo Church in Princeton)
- During the 2nd World War:  
Government Code and Cypher School (GCCS) Britain’s codebreaking centre.  
For a time head of the section responsible for German naval cryptanalysis and devised a number of techniques for breaking German ciphers.
- After the war: National Physical Laboratory, Computing Laboratory, University of Manchester
- Contributions to AI (“Turing-Test”)
- Tragical death

One of the most important awards in computer science: Turing Award.

# Turing machines

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A Turing machine is a device that manipulates symbols on a strip of tape according to a table of rules. It represents an algorithm or a program.

# Turing machines

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Alan Turing described a Turing machine (which he called “Logical Computing Machine” ), as consisting of:

“ ... an unlimited memory capacity obtained in the form of an infinite tape marked out into squares, on each of which a symbol could be printed.

At any moment there is one symbol in the machine; it is called the scanned symbol.

The machine can alter the scanned symbol and its behavior is in part determined by that symbol, but the symbols on the tape elsewhere do not affect the behaviour of the machine.

However, the tape can be moved back and forth through the machine, this being one of the elementary operations of the machine. Any symbol on the tape may therefore eventually have an innings.”

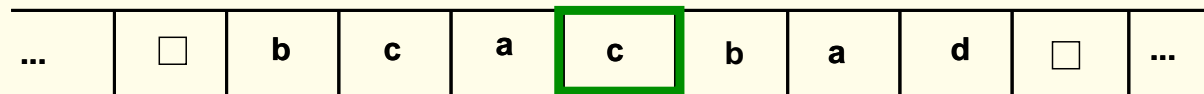
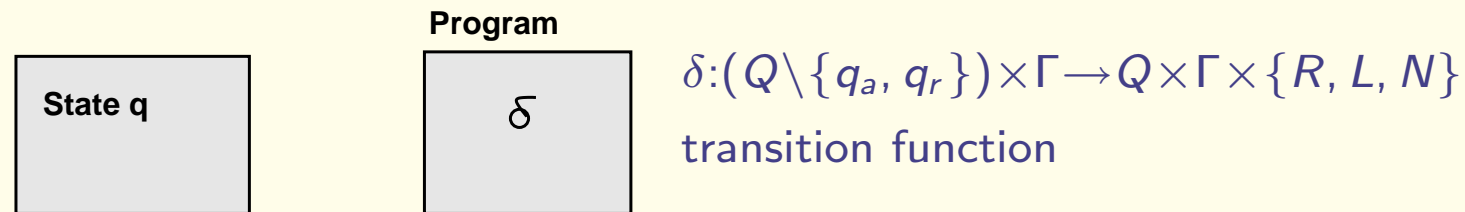
# Deterministic Turing machines

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$Q$ : finite, non-empty set of states

$q_i \in Q$  initial state

$q_a \in Q$  final accepting state;  $q_r \in Q$  final rejecting state



read/write-head

Tape (unlimited both ways)

$\Sigma$ : finite, non-empty input alphabet;  $\square \in \Gamma \setminus \Sigma$ , blank symbol

$\Gamma \supset \Sigma$ , finite, non-empty tape alphabet

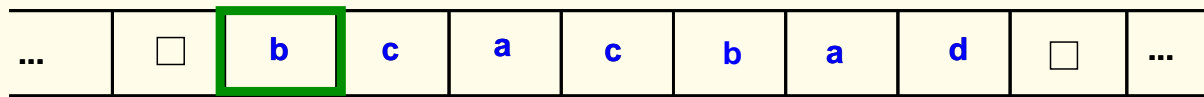
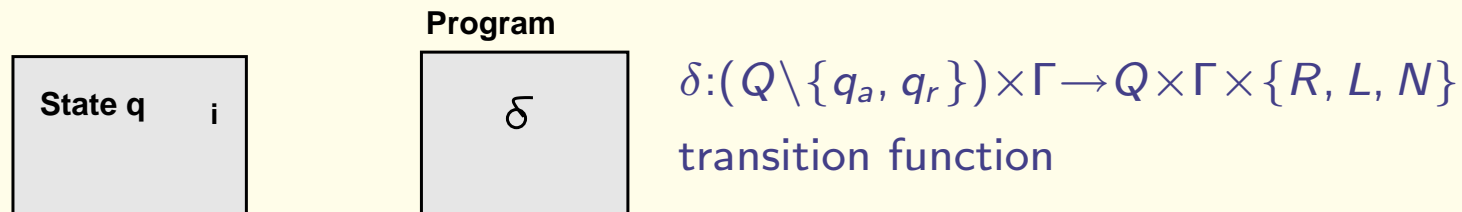
# Turing machines: Input

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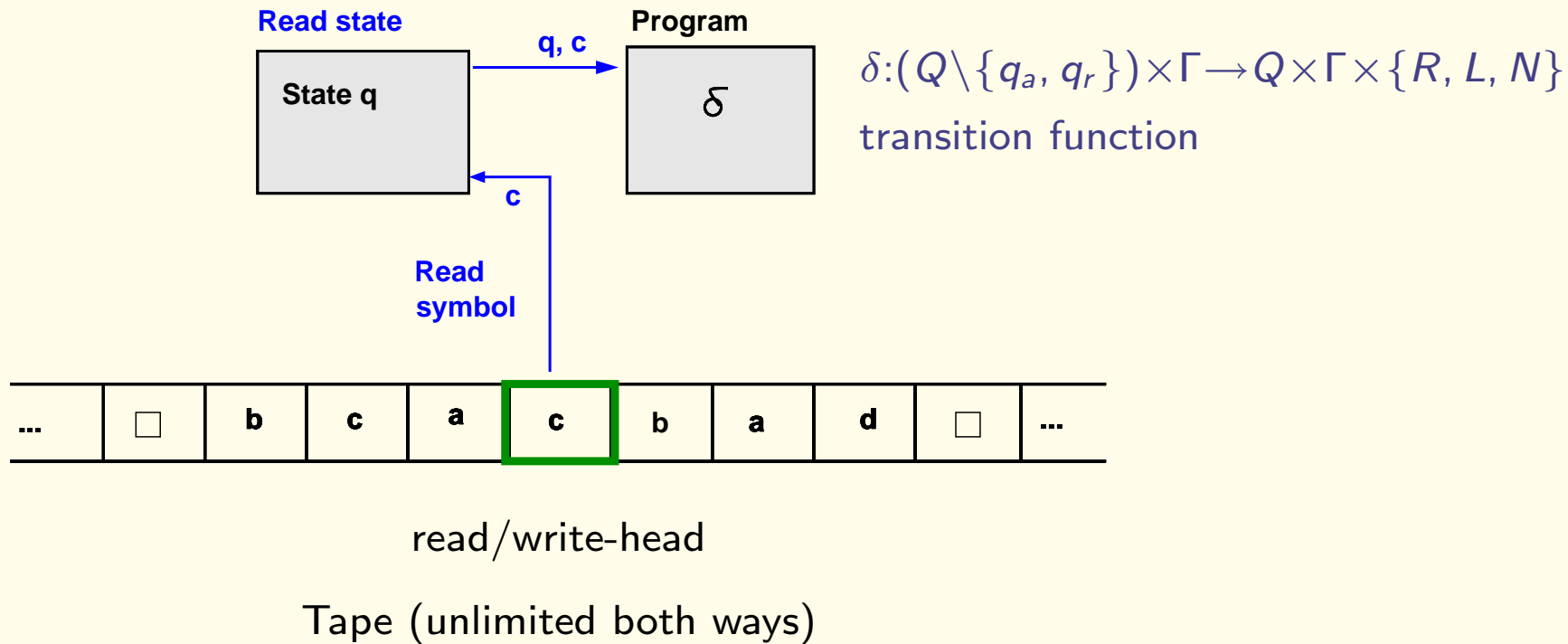


# Turing machines: Computation step

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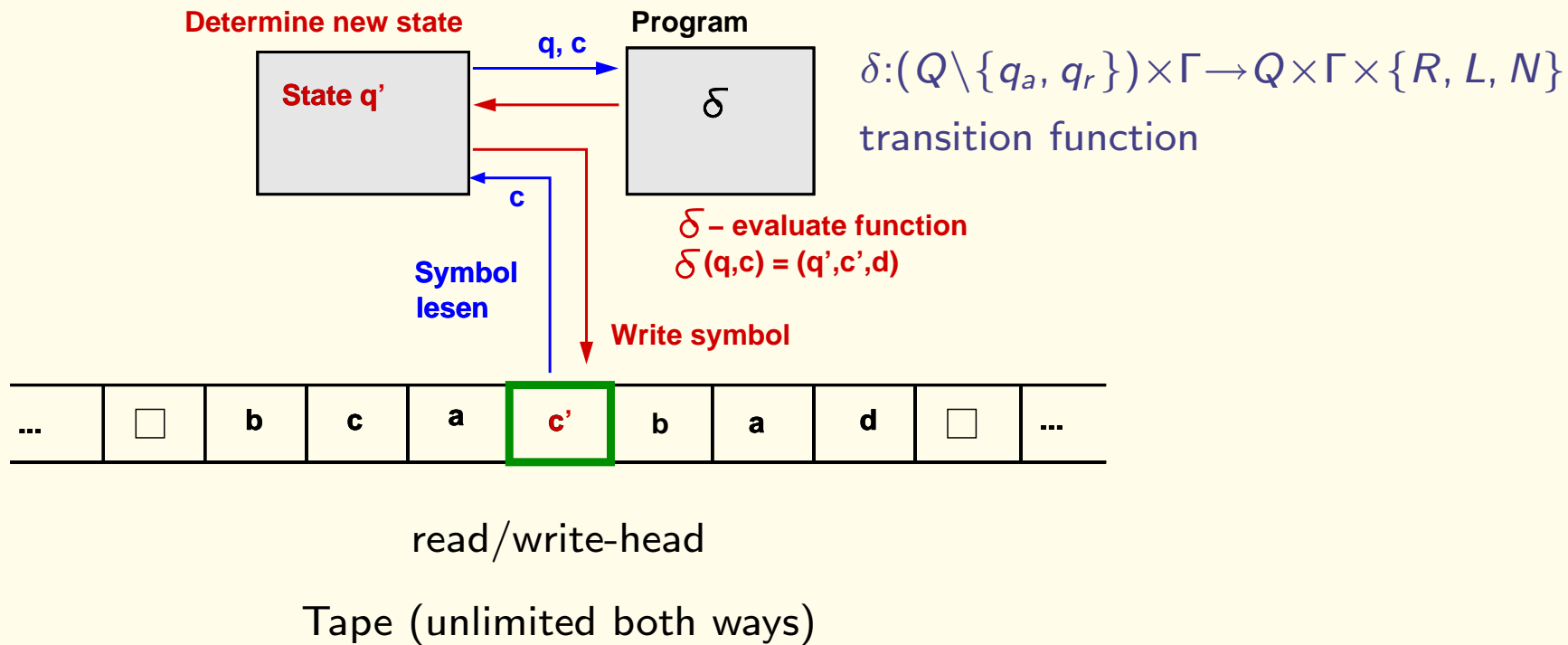
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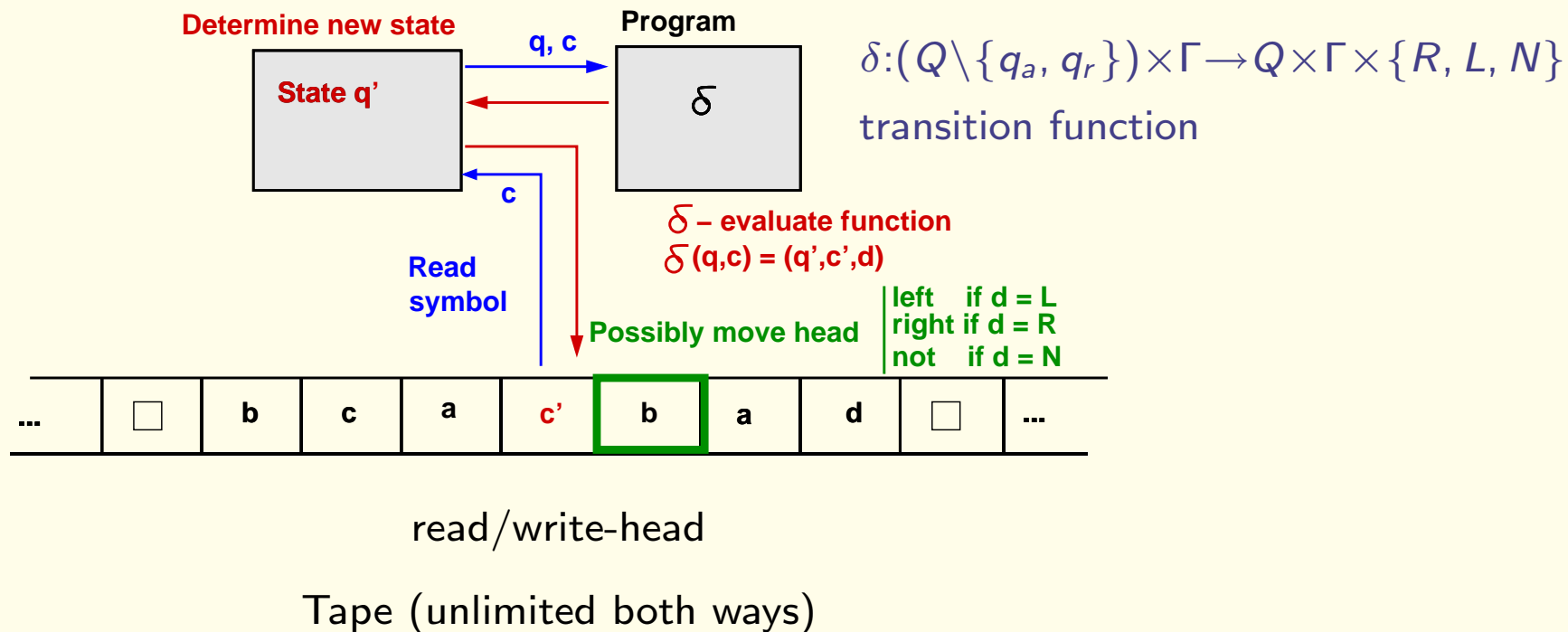
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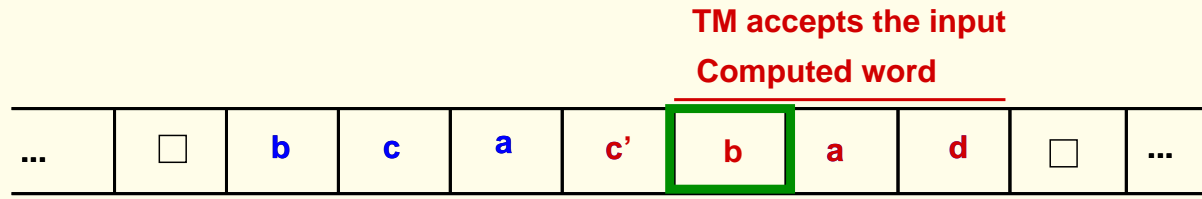
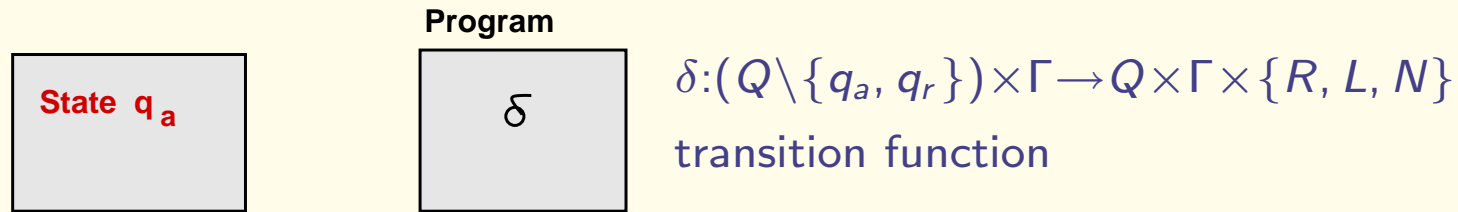
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# Turing machines: End of the computation

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read/write-head

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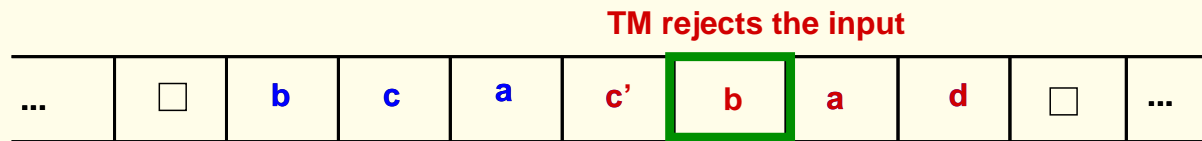
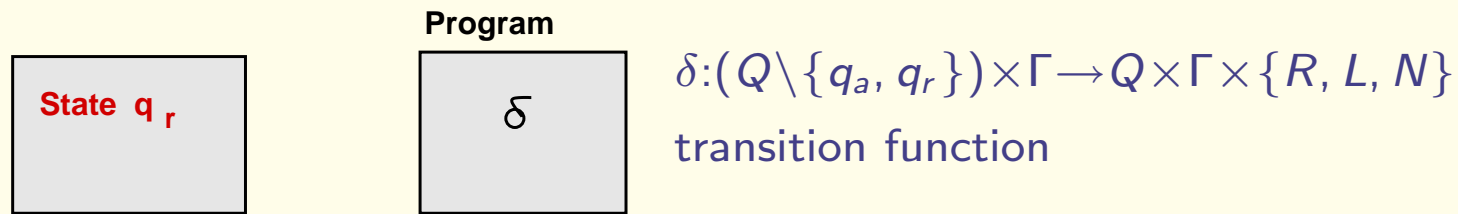
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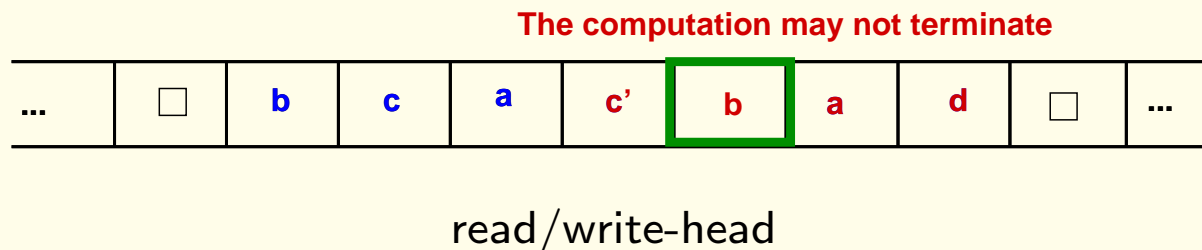
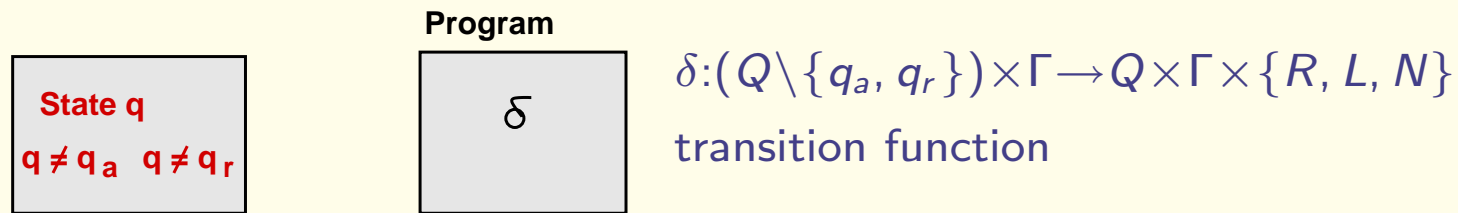
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# Turing-Computability/Decidability

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## Definition

- A function  $f : \Sigma^* \rightarrow \Sigma^*$  is **Turing computable**, if there exists a Turing machine, which terminates for all inputs and:  
$$\forall x, y \in \Sigma^* \quad f(x) = y \quad \text{iff} \quad M \text{ computes } y \text{ from input } x.$$
- A TM  $M$  accepts  $w \in \Sigma^*$  if the computation of  $M$  on  $x$  terminates in state  $q_a$ .

## Definition

- A language  $L \subseteq \Sigma^*$  is **Turing decidable**, if there is a Turing machine, which terminates for all inputs and accepts the input  $w$  iff  $w \in L$ .
- A problem  $P : \Sigma^* \rightarrow \{\text{Yes, No}\}$  is **Turing decidable**, if there exists a Turing machine, which terminates on all inputs and accepts the input  $w$  iff  $w \in L = P^{-1}(\text{Yes})$ .

# Contents

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- Recall: Turing machines and Turing computability
- **Register machines (LOOP, WHILE, GOTO)**
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- The Church-Turing Thesis
- Computability and (Un-)decidability
- Complexity
- Other computation models: e.g. Büchi Automata



# Register Machines

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In comparison to Turing machines:

- equally powerful fundament for computability theory
- **Advantage:** Programs are easier to understand

# Register Machines

---

In comparison to Turing machines:

- equally powerful fundament for computability theory
- **Advantage:** Programs are easier to understand

similar to ...

the imperative kernel of programming languages

pseudo-code

# Register Machines

---

Computation of  $a \bmod b$  (pseudocode)

$r := a;$

while  $r \geq b$  do

$r := r - b;$

end;

return  $r$

# Register Machines

---

## Definition: Questions

Which instructions (if, while, goto?)

Which data types? (integers? strings?)

Which data structures? (arrays?)

Which atomic instructions?

Which Input/Output?

# Register Machines

---

## Definition: Questions

Which instructions (if, while, goto?)

Which data types? (integers? strings?)

Which data structures? (arrays?)

Which atomic instructions?

Which Input/Output?

**Here:** LOOP-programs; WHILE-programs; GOTO-programs

Links between LOOP, WHILE, GOTO and Turing machines.

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# Recursive functions

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## Motivation

Functions as model of computation (without an underlying machine model)

# Recursive functions

---

## Motivation

Functions as model of computation (without an underlying machine model)

## Idea

- Simple (“atomic”) functions are computable
- “Combinations” of computable functions are computable

(We consider functions  $f : \mathbb{N}^k \rightarrow \mathbb{N}$ ,  $k \geq 0$ )



# Recursive functions

---

## Motivation

Functions as model of computation (without an underlying machine model)

## Idea

- Simple (“atomic”) functions are computable
- “Combinations” of computable functions are computable

(We consider functions  $f : \mathbb{N}^k \rightarrow \mathbb{N}$ ,  $k \geq 0$ )

## Questions

- Which are the atomic functions?
- Which combinations are possible?

# Recursive functions

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## Atomic functions:

Constant null; successor; projection (choice)

# Recursive functions

---

## Atomic functions:

Constant null; successor; projection (choice)

## Composition

function composition

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# The Church-Turing Thesis

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**Informally:** The functions which are intuitively computable are exactly the functions which are Turing computable.

# The Church-Turing Thesis

---

**Informally:** The functions which are intuitively computable are exactly the functions which are Turing computable.

**Instances of this thesis:** all known models of computation

- Turing machines
- Recursive functions
- $\lambda$ -functions
- all known programming languages (imperative, functional, logic)

provide the same notion of computability

# Alonzo Church

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## Alonzo Church (1903-1995)

- studied in Princeton; PhD in Princeton
- Postdoc in Göttingen
- Professor: Princeton and UCLA
- Layed the foundations of theoretical computer science (e.g. introduced the  $\lambda$ -calculus)
- One of the most important computer scientists



# Alonzo Church

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## PhD Students:

- **Peter Andrews:** automated reasoning
- **Martin Davis:** Davis-Putnam procedure (automated reasoning)
- **Leon Henkin:** (Standard) proof of completeness of predicate logic
- **Stephen Kleene:** Regular expressions
- **Dana Scott:** Denotational Semantics, Automata theory
- **Raymond Smullyan:** Tableau calculi
- **Alan Turing:** Turing machines, Undecidability of the halting problem
- ... and many others



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# Computability and (Un-)decidability

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Known undecidable problems (Theoretical Computer Science I)

- The halting problem for Turing machines

# Computability and (Un-)decidability

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Known undecidable problems (Theoretical Computer Science I)

- The halting problem for Turing machines

## Consequences:

- All problems about programs (TM) which are non-trivial (in a certain sense) are undecidable (Theorem of Rice)
  - Identify undecidable problems outside the world of Turing machines
    - Validity/Satisfiability in First-Order Logic
    - The Post Correspondence Problem
- ↳ undecidability results in formal languages
- These results show that Hilbert's Program is not realisable.

# Computability and (Un-)decidability

---

## The Theorem of Rice (informal)

For each non-trivial property  $P$  of (partial) functions:

It is undecidable, whether the function computed by a Turing machine has property  $P$ .

# Computability and (Un-)decidability

---

## The Theorem of Rice (informal)

For each non-trivial property  $P$  of (partial) functions:

It is undecidable, whether the function computed by a Turing machine has property  $P$ .

## Variant 2

For each non-trivial property  $P$  of languages of type 0:

It is undecidable, whether the language accepted by a Turing machine has property  $P$ .

# Computability and (Un-)decidability

---

## The Theorem of Rice (informal)

For each non-trivial property  $P$  of (partial) functions:

It is undecidable, whether the function computed by a Turing machine has property  $P$ .

## Generalization:

The same holds for other computability models:

- algorithms
- Java programs
- $\lambda$  expressions
- recursive functions
- etc.

# Henry Gordon Rice

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**Henry Gordon Rice** (born 1920)

best known as the author of Rice's theorem, which he proved in his doctoral dissertation of 1951 at Syracuse University.

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# Complexity

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- Complexity classes; Relationships between complexity classes (P, NP, PSPACE)
- How to show that a given problem is in a certain class?  
Reduction to known problems (e.g. SAT)
- Complete and hard problems
- Closure properties for complexity classes
- Examples

# Stephen Cook

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## Stephen Arthur Cook (born 1939)

- Major contributions to complexity theory.  
Considered one of the forefathers of computational complexity theory.
- 1971 'The Complexity of Theorem Proving Procedures'  
Formalized the notions of polynomial-time reduction and NP-completeness, and proved the existence of an NP-complete problem by showing that the Boolean satisfiability problem (SAT) is NP-complete.
- Currently University Professor at the University of Toronto
- 1982: Turing award for his contributions to complexity theory.



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# Büchi Automata

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## $\omega$ -Automata

An  $\omega$ -automaton (or stream automaton) is a variation of finite automaton that runs on infinite, rather than finite, strings as input.

Since  $\omega$ -automata do not stop, they have a variety of acceptance conditions rather than simply a set of accepting states.

Classes of  $\omega$ -automata include the Büchi automata, Rabin automata, Streett automata, parity automata and Muller automata, each deterministic or non-deterministic (differ only in terms of acceptance condition).

They all recognize precisely the regular  $\omega$ -languages except for the deterministic Büchi automata, which is strictly weaker than all the others.

# Büchi Automata

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## Büchi automaton

Accepts an infinite input sequence iff there exists a run of the automaton that visits (at least) one of the final states infinitely often.

Büchi automata are often used in Model checking as an automata-theoretic version of a formula in linear temporal logic.

Model checking of finite state systems can often be translated into various operations on Büchi automata.

# Other models of computation

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- The  $\lambda$ -calculus

Presented in the lecture “Programming language theory”

Brief idea in what follows

# The $\lambda$ -calculus

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Lambda calculus (also written as  $\lambda$ -calculus) is a formal system in mathematical logic for expressing computation by way of variable binding and substitution.

It was first formulated by Alonzo Church as a way to formalize mathematics through the notion of functions, in contrast to the field of set theory.

# Example

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The identity function  $id(x) = x$ : input  $x$ ; returns  $x$

$sqsum(x, y) = x \cdot x + y \cdot y$ : input  $(x, y)$ ; returns  $x^2 + y^2$ .



# Example

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$sqsum(x, y) = x \cdot x + y \cdot y$ : input  $(x, y)$ ; returns  $x^2 + y^2$ .

Observations:

1. functions need not be explicitly named.

$sqsum(x, y) = x \cdot x + y \cdot y$  can be rewritten as  $(x, y) \mapsto x \cdot x + y \cdot y$

$id(x) = x$  can be rewritten as  $x \mapsto x$

2. The specific choice of name for a function's arguments is irrelevant.

$x \mapsto x$  and  $y \mapsto y$  express the same function: the identity.

3. Any function that requires two inputs, for instance  $sqsum$  can be reworked into an equivalent function that accepts a single input, and as output returns another function, that in turn accepts a single input.

$x \mapsto (y \mapsto x \cdot x + y \cdot y)$

(currying; can be generalized to functions with arbitrary number of arguments)

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## Observations:

1. functions need not be explicitly named.

$sqsum(x, y) = x \cdot x + y \cdot y$  can be rewritten as  $\lambda x, y. (x \cdot x + y \cdot y)$

$id(x) = x$  can be rewritten as  $\lambda x. x$

2. The specific choice of name for a function's arguments is irrelevant.

$\lambda x. x$  and  $\lambda y. y$  express the same function: the identity.

3. Any function that requires two inputs, for instance  $sqsum$  can be reworked into an equivalent function that accepts a single input, and as output returns another function, that in turn accepts a single input.

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$\lambda x. \lambda y. (x \cdot x + y \cdot y)$

(currying; can be generalized to functions with arbitrary number of arguments)

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Lambda calculus has played an important role in the development of the theory of programming languages. The most prominent counterparts to lambda calculus in computer science are functional programming languages, which essentially implement the calculus (augmented with some constants and datatypes).