

# CS:4350 Logic in Computer Science

## Introduction

Cesare Tinelli

Spring 2022



# Credits

These slides are largely based on slides originally developed by **Andrei Voronkov** at the University of Manchester. Adapted by permission.

# What is mathematical logic?

A branch of science that

- formalizes valid methods of reasoning
- was originally developed to formalize mathematics
- provides the mathematical foundations of CS
- drives several applications in CS and beyond

# What is mathematical logic?

A branch of science that

- formalizes valid methods of reasoning
- was originally developed to formalize mathematics
- provides the mathematical foundations of CS
- drives several applications in CS and beyond

# What is mathematical logic?

A branch of science that

- formalizes valid methods of reasoning
- was originally developed to formalize mathematics
- provides the mathematical foundations of CS
- drives several applications in CS and beyond

# What is mathematical logic?

A branch of science that

- formalizes valid methods of reasoning
- was originally developed to formalize mathematics
- provides the mathematical foundations of CS
- drives several applications in CS and beyond

# What is mathematical logic?

A branch of science that

- formalizes valid methods of reasoning
- was originally developed to formalize mathematics
- provides the mathematical foundations of CS
- drives several applications in CS and beyond

# A bit of history

Logic as a discipline in Western thought dates back to the ancient Greeks

Aristotle and Stoic philosophers formulated systems of reasoning in the 4th century BCE

Independent studies were done in China (MoZi or Micius, 4th c. BCE) and India (Dignaga, 6th c. CE)

Christian (Boethius 6th c.; Ockham, 14th c.) and Islamic (Ibn Sina or Avicenna, 10th c.) philosophers advanced Aristotle's idea in the middle ages

A major leap occurred in the 19th century in Europe with the goal of formalizing mathematics (Boole, Frege, Peano, ...)

In the 20th century, European (Göedel, Turing, ...) and American (Tarski, Church, Scott, ...) logicians effectively laid down the foundations of CS, largely before computers were invented!

Presently, *mathematical logic has become to CS what calculus is to physics*



## A bit of history

Logic as a discipline in Western thought dates back to the ancient Greeks

Aristotle and Stoic philosophers formulated systems of reasoning in the 4th century BCE

Independent studies were done in China (MoZi or Micius, 4th c. BCE) and India (Dignaga, 6th c. CE)

Christian (Boethius 6th c.; Ockham, 14th c.) and Islamic (Ibn Sina or Avicenna, 10th c.) philosophers advanced Aristotle's idea in the middle ages

A major leap occurred in the 19th century in Europe with the goal of formalizing mathematics (Boole, Frege, Peano, ...)

In the 20th century, European (Göedel, Turing, ...) and American (Tarski, Church, Scott, ...) logicians effectively laid down the foundations of CS, largely before computers were invented!

Presently, *mathematical logic has become to CS what calculus is to physics*

# A bit of history

Logic as a discipline in Western thought dates back to the ancient Greeks

Aristotle and Stoic philosophers formulated systems of reasoning in the 4th century BCE

Independent studies were done in China (MoZi or Micius, 4th c. BCE) and India (Dignaga, 6th c. CE)

Christian (Boethius 6th c.; Ockham, 14th c.) and Islamic (Ibn Sina or Avicenna, 10th c.) philosophers advanced Aristotle's idea in the middle ages

A major leap occurred in the 19th century in Europe with the goal of formalizing mathematics (Boole, Frege, Peano, ...)

In the 20th century, European (Göedel, Turing, ...) and American (Tarski, Church, Scott, ...) logicians effectively laid down the foundations of CS, largely before computers were invented!

Presently, *mathematical logic has become to CS what calculus is to physics*

# A bit of history

Logic as a discipline in Western thought dates back to the ancient Greeks

Aristotle and Stoic philosophers formulated systems of reasoning in the 4th century BCE

Independent studies were done in China (MoZi or Micius, 4th c. BCE) and India (Dignaga, 6th c. CE)

Christian (Boethius 6th c.; Ockham, 14th c.) and Islamic (Ibn Sina or Avicenna, 10th c.) philosophers advanced Aristotle's idea in the middle ages

A major leap occurred in the 19th century in Europe with the goal of formalizing mathematics (Boole, Frege, Peano, ...)

In the 20th century, European (Göedel, Turing, ...) and American (Tarski, Church, Scott, ...) logicians effectively laid down the foundations of CS, largely before computers were invented!

Presently, *mathematical logic has become to CS what calculus is to physics*

# A bit of history

Logic as a discipline in Western thought dates back to the ancient Greeks

Aristotle and Stoic philosophers formulated systems of reasoning in the 4th century BCE

Independent studies were done in China (MoZi or Micius, 4th c. BCE) and India (Dignaga, 6th c. CE)

Christian (Boethius 6th c.; Ockham, 14th c.) and Islamic (Ibn Sina or Avicenna, 10th c.) philosophers advanced Aristotle's idea in the middle ages

A major leap occurred in the 19th century in Europe with the goal of formalizing mathematics (Boole, Frege, Peano, ...)

In the 20th century, European (Göedel, Turing, ...) and American (Tarski, Church, Scott, ...) logicians effectively laid down the foundations of CS, largely before computers were invented!

Presently, *mathematical logic has become to CS what calculus is to physics*

# A bit of history

Logic as a discipline in Western thought dates back to the ancient Greeks

Aristotle and Stoic philosophers formulated systems of reasoning in the 4th century BCE

Independent studies were done in China (MoZi or Micius, 4th c. BCE) and India (Dignaga, 6th c. CE)

Christian (Boethius 6th c.; Ockham, 14th c.) and Islamic (Ibn Sina or Avicenna, 10th c.) philosophers advanced Aristotle's idea in the middle ages

A major leap occurred in the 19th century in Europe with the goal of formalizing mathematics (Boole, Frege, Peano, ...)

In the 20th century, European (Göedel, Turing, ...) and American (Tarski, Church, Scott, ...) logicians effectively laid down the foundations of CS, largely before computers were invented!

*Presently, mathematical logic has become to CS what calculus is to physics*

# A bit of history

Logic as a discipline in Western thought dates back to the ancient Greeks

Aristotle and Stoic philosophers formulated systems of reasoning in the 4th century BCE

Independent studies were done in China (MoZi or Micius, 4th c. BCE) and India (Dignaga, 6th c. CE)

Christian (Boethius 6th c.; Ockham, 14th c.) and Islamic (Ibn Sina or Avicenna, 10th c.) philosophers advanced Aristotle's idea in the middle ages

A major leap occurred in the 19th century in Europe with the goal of formalizing mathematics (Boole, Frege, Peano, ...)

In the 20th century, European (Göedel, Turing, ...) and American (Tarski, Church, Scott, ...) logicians effectively laid down the foundations of CS, largely before computers were invented!

Presently, *mathematical logic has become to CS what calculus is to physics*

# Logic as the foundation of Computer Science

Logical methods are used to define

# Logic as the foundation of Computer Science

Logical methods are used to define

- the very idea of computation and computability
- the semantics of logical gates and circuits
- the operational semantics of programming languages
- the computational complexity of algorithms
- types systems and type checking
- distributed systems and protocols
- database semantics
- knowledge representation in AI
- ...



# Logic as the foundation of Computer Science

Logical methods are used to define

- the very idea of computation and computability
- the semantics of logical gates and circuits
- the operational semantics of programming languages
- the computational complexity of algorithms
- types systems and type checking
- distributed systems and protocols
- database semantics
- knowledge representation in AI
- ...

# Logic as the foundation of Computer Science

Logical methods are used to define

- the very idea of computation and computability
- the semantics of logical gates and circuits
- the operational semantics of programming languages
- the computational complexity of algorithms
- types systems and type checking
- distributed systems and protocols
- database semantics
- knowledge representation in AI
- ...

# Logic as the foundation of Computer Science

Logical methods are used to define

- the very idea of computation and computability
- the semantics of logical gates and circuits
- the operational semantics of programming languages
- **the computational complexity of algorithms**
- types systems and type checking
- distributed systems and protocols
- database semantics
- knowledge representation in AI
- ...

# Logic as the foundation of Computer Science

Logical methods are used to define

- the very idea of computation and computability
- the semantics of logical gates and circuits
- the operational semantics of programming languages
- the computational complexity of algorithms
- **types systems and type checking**
- distributed systems and protocols
- database semantics
- knowledge representation in AI
- ...

# Logic as the foundation of Computer Science

Logical methods are used to define

- the very idea of computation and computability
- the semantics of logical gates and circuits
- the operational semantics of programming languages
- the computational complexity of algorithms
- types systems and type checking
- distributed systems and protocols
- database semantics
- knowledge representation in AI
- ...

# Logic as the foundation of Computer Science

Logical methods are used to define

- the very idea of computation and computability
- the semantics of logical gates and circuits
- the operational semantics of programming languages
- the computational complexity of algorithms
- types systems and type checking
- distributed systems and protocols
- **database semantics**
- knowledge representation in AI
- ...

# Logic as the foundation of Computer Science

Logical methods are used to define

- the very idea of computation and computability
- the semantics of logical gates and circuits
- the operational semantics of programming languages
- the computational complexity of algorithms
- types systems and type checking
- distributed systems and protocols
- database semantics
- knowledge representation in AI
- ...

# Logic as the foundation of Computer Science

Logical methods are used to define

- the very idea of computation and computability
- the semantics of logical gates and circuits
- the operational semantics of programming languages
- the computational complexity of algorithms
- types systems and type checking
- distributed systems and protocols
- database semantics
- knowledge representation in AI
- ...



# Logics

A logic is also a **formal mathematical construct**

Each logic is characterized by its own:

- syntax and semantics
- inference mechanisms
- proof theory and model theory

Many formal logics have been developed

We will study several logics used in CS

# Logics

A logic is also a **formal mathematical construct**

Each logic is characterized by its own:

- syntax and semantics
- inference mechanisms
- proof theory and model theory

Many formal logics have been developed

We will study several logics used in CS

# Logics

A logic is also a **formal mathematical construct**

Each logic is characterized by its own:

- **syntax** and **semantics**
- **inference** mechanisms
- **proof theory** and **model theory**

Many formal logics have been developed

We will study several logics used in CS

# Logics

A logic is also a **formal mathematical construct**

Each logic is characterized by its own:

- **syntax** and **semantics**
- **inference** mechanisms
- **proof theory** and **model theory**

Many formal logics have been developed

We will study several logics used in CS

# Logics

A logic is also a **formal mathematical construct**

Each logic is characterized by its own:

- **syntax** and **semantics**
- **inference** mechanisms
- **proof theory** and **model theory**

Many formal logics have been developed

We will study several logics used in CS

## Motivation: computational systems and correctness

Suppose we design a complex system containing various components such as sensors, networks, computers

All of these components now use software

## Motivation: computational systems and correctness

Suppose we design a complex system containing various components such as sensors, networks, computers

All of these components now use software

We have requirements on how the system should function, for example **safety, reliability, security, availability, absence of deadlocks**, etc.

## Motivation: computational systems and correctness

Suppose we design a complex system containing various components such as sensors, networks, computers

All of these components now use software

We have requirements on how the system should function, for example **safety, reliability, security, availability, absence of deadlocks**, etc.

How can one ensure that **the system satisfies these requirements?**



## Motivation: computational systems and correctness

Suppose we design a complex system containing various components such as sensors, networks, computers

All of these components now use software

We have requirements on how the system should function, for example **safety, reliability, security, availability, absence of deadlocks**, etc.

How can one ensure that **the system satisfies these requirements?**

Most modern computer systems are **unreliable**

## Small Example: Software

Consider the following fragment of a C program:

```
int* allocateArray(int length)
{
    int i;
    int* array;
    array = malloc(sizeof(int) * length);

    for (i = 0; i <= length; i++)
        array[i] = 0;
    return array;
}
```

Is this program correct?

## Small Example: Software

Consider the following fragment of a C program:

```
int* allocateArray(int length)
{
    int i;
    int* array;
    array = malloc(sizeof(int) * length);

    for (i = 0; i <= length; i++)
        array[i] = 0;
    return array;
}
```

Is this program correct? **Hardly: it writes into memory that has not been allocated**

## Small Example: Software

Consider the following fragment of a C program:

```
int* allocateArray(int length)
{
    int i;
    int* array;
    array = malloc(sizeof(int) * length);

    for (i = 0; i < length; i++)
        array[i] = 0;
    return array;
}
```

Is this program correct?

## Small Example: Software

Consider the following fragment of a C program:

```
int* allocateArray(int length)
{
    int i;
    int* array;
    array = malloc(sizeof(int) * length); // may return 0!

    for (i = 0; i < length; i++)
        array[i] = 0;
    return array;
}
```

Is this program correct? **No: it may write to the null address**

## Small Example: Software

Consider the following fragment of a C program:

```
int* allocateArray(int length)
{
    int i;
    int* array;
    array = malloc(sizeof(int) * length);
    if (!array) return 0;
    for (i = 0; i < length; i++)
        array[i] = 0;
    return array;
}
```

Is this program correct?

## Small Example: Software

Consider the following fragment of a C program:

```
/* Returns a new array of integers of a given
   length initialized by a non-zero value */
int* allocateArray(int length)
{
    int i;
    int* array;
    array = malloc(sizeof(int) * length);
    if (!array) return 0;
    for (i = 0; i < length; i++)
        array[i] = 0;
    return array;
}
```

Is this program correct?

## Small Example: Software

Consider the following fragment of a C program:

```
/* Returns a new array of integers of a given
   length initialized by a non-zero value */
int* allocateArray(int length)
{
    int i;
    int* array;
    array = malloc(sizeof(int) * length);
    if (!array) return 0;
    for (i = 0; i < length; i++)
        array[i] = 0;
    return array;
}
```

Is this program correct? **No: it initializes the array by zeros**



## Small Example: Software

Consider the following fragment of a C program:

```
/* Returns a new array of integers of a given
   length initialized by a non-zero value */
int* allocateArray(int length)
{
    int i;
    int* array;
    array = malloc(sizeof(int) * length);
    if (!array) return 0;
    for (i = 0; i < length; i++)
        array[i] = 0;
    return array;
}
```

We discussed **correctness** of a program without ever defining what it means

## Small Example: Software

Consider the following fragment of a C program:

```
/* Returns a new array of integers of a given
   length initialized by a non-zero value */
int* allocateArray(int length)
{
    int i;
    int* array;
    array = malloc(sizeof(int) * length);
    if (!array) return 0;
    for (i = 0; i < length; i++)
        array[i] = 0;
    return array;
}
```

So, what is correctness?

We discussed **correctness** of a program without ever defining what it means

## Note

- We could spot the *first two errors* without knowing anything about the **intended purpose** of the **program**
- However, we had to understand the meaning of C programs in general and some specific properties of programming in C
- To understand the *last error* we had to know something about the program's intended behavior

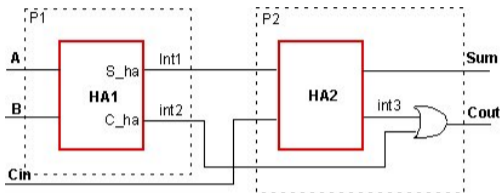
## Note

- We could spot the *first two errors* without knowing anything about the **intended purpose** of the **program**
- However, we had to understand the meaning of C programs in general and some specific properties of programming in C
- To understand the *last error* we had to know something about the program's intended behavior

## Note

- We could spot the *first two errors* without knowing anything about the **intended purpose** of the **program**
- However, we had to understand the meaning of C programs in general and some specific properties of programming in C
- To understand the *last error* we had to know something about the **program's intended behavior**

## Another example: circuit design

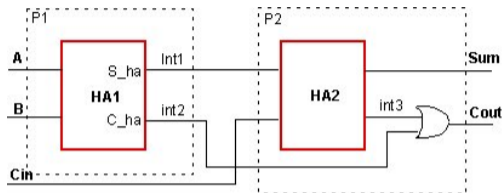


We would like to replace a circuit  $C_1$  in a processor by another circuit  $C_2$  (because, say,  $C_2$  results in a lower energy consumption)

We want to be sure that  $C_2$  is correct, that is, it will behave according to some specification

If we already know that  $C_1$  is correct, it is sufficient to prove that  $C_2$  is functionally equivalent to  $C_1$

## Another example: circuit design

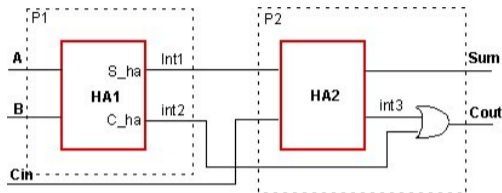


We would like to replace a circuit  $C_1$  in a processor by another circuit  $C_2$  (because, say,  $C_2$  results in a lower energy consumption)

We want to be sure that  $C_2$  is **correct**, that is, it will behave **according to some specification**

If we already know that  $C_1$  is correct, it is sufficient to **prove that  $C_2$  is functionally equivalent to  $C_1$**

## Another example: circuit design



We would like to replace a circuit  $C_1$  in a processor by another circuit  $C_2$  (because, say,  $C_2$  results in a lower energy consumption)

We want to be sure that  $C_2$  is **correct**, that is, it will behave **according to some specification**

If we already know that  $C_1$  is correct, it is sufficient to **prove** that  $C_2$  is **functionally equivalent** to  $C_1$



# How to establish correctness of a system

1. Consider the system as a mathematical object by building a **formal model** of the system
2. Find a formal language  $\mathcal{L}$  for expressing intended properties
3. The language must have a formal semantics, defining the possible interpretations of the sentences of  $\mathcal{L}$ 
  - The semantics is normally based on notions of truth and satisfiability
4. Write a specification, that is, intended properties of the system in this language
5. Prove formally that the system model satisfies the specification

# How to establish correctness of a system

1. Consider the system as a mathematical object by building a formal model of the system
2. Find a formal language  $\mathcal{L}$  for expressing intended properties
3. The language must have a formal semantics, defining the possible interpretations of the sentences of  $\mathcal{L}$ 
  - The semantics is normally based on notions of truth and satisfiability
4. Write a specification, that is, intended properties of the system in this language
5. Prove formally that the system model satisfies the specification

# How to establish correctness of a system

1. Consider the system as a mathematical object by building a formal model of the system
2. Find a formal language  $\mathcal{L}$  for expressing intended properties
3. The language must have a formal **semantics**, defining the possible interpretations of the sentences of  $\mathcal{L}$ 
  - The semantics is normally based on notions of **truth** and **satisfiability**
4. Write a **specification**, that is, intended properties of the system in this language
5. **Prove** formally that the system model satisfies the specification

# How to establish correctness of a system

1. Consider the system as a mathematical object by building a formal model of the system
2. Find a formal language  $\mathcal{L}$  for expressing intended properties
3. The language must have a formal semantics, defining the possible interpretations of the sentences of  $\mathcal{L}$ 
  - The semantics is normally based on notions of truth and satisfiability
4. Write a **specification**, that is, intended properties of the system in this language
5. Prove formally that the system model satisfies the specification

# How to establish correctness of a system

1. Consider the system as a mathematical object by building a formal model of the system
2. Find a formal language  $\mathcal{L}$  for expressing intended properties
3. The language must have a formal semantics, defining the possible interpretations of the sentences of  $\mathcal{L}$ 
  - The semantics is normally based on notions of truth and satisfiability
4. Write a specification, that is, intended properties of the system in this language
5. **Prove** formally that the system model satisfies the specification

# How to establish correctness of a system

1. Consider the system as a mathematical object by building a formal model of the system
2. Find a formal language  $\mathcal{L}$  for expressing intended properties
3. The language is chosen from among all the possible languages.
  - The language is chosen from among all the possible languages.
4. Write a specification, that is, intended properties of the system in this language
5. Prove formally that the system model satisfies the specification

All of this can be done with the **proper logic**

# Logics, formally

A logic is a triple  $(\mathcal{L}, \mathcal{S}, \mathcal{R})$  where

- $\mathcal{L}$ , the *language*, is  
a class of sentences described by a formal grammar
- $\mathcal{S}$ , the *semantics*, is  
a formal specification for assigning meaning to sentences in  $\mathcal{L}$
- $\mathcal{R}$ , the *derivation (or, inference) system*, is  
a set of *axioms* (i.e., valid sentences) and *derivation rules* to  
*derive* (i.e., generate) sentences of  $\mathcal{L}$  from given sentences of  $\mathcal{L}$

## Logics, formally

A logic is a triple  $(\mathcal{L}, \mathcal{S}, \mathcal{R})$  where

- $\mathcal{L}$ , the *language*, is  
a class of sentences described by a formal grammar
- $\mathcal{S}$ , the *semantics*, is  
a formal specification for assigning meaning to sentences in  $\mathcal{L}$
- $\mathcal{R}$ , the *derivation (or, inference) system*, is  
a set of *axioms* (i.e., valid sentences) and *derivation rules* to  
*derive* (i.e., generate) sentences of  $\mathcal{L}$  from given sentences of  $\mathcal{L}$



## Logics, formally

A logic is a triple  $(\mathcal{L}, \mathcal{S}, \mathcal{R})$  where

- $\mathcal{L}$ , the *language*, is  
a class of sentences described by a formal grammar
- $\mathcal{S}$ , the *semantics*, is  
a formal specification for assigning meaning to sentences in  $\mathcal{L}$
- $\mathcal{R}$ , the *derivation (or, inference) system*, is  
a set of *axioms* (i.e., valid sentences) and *derivation rules* to  
*derive* (i.e., generate) sentences of  $\mathcal{L}$  from given sentences of  $\mathcal{L}$

## Logics, formally

A logic is a triple  $(\mathcal{L}, \mathcal{S}, \mathcal{R})$  where

- $\mathcal{L}$ , the *language*, is a class of sentences described by a formal grammar
- $\mathcal{S}$ , the *semantics*, is a formal specification for assigning meaning to sentences in  $\mathcal{L}$
- $\mathcal{R}$ , the *derivation (or, inference) system*, is a set of **axioms** (i.e., valid sentences) and **derivation rules** to *derive* (i.e., generate) sentences of  $\mathcal{L}$  from given sentences of  $\mathcal{L}$

# Derivations Systems

Important theoretical properties:

**Consistency** It is impossible to derive both a sentence and its negation from the axioms

**Independence** No axiom is derivable from the others

**Soundness** All derivable sentences are valid (always true)

**Completeness** All valid sentences are derivable

# My God, it's full of logics!



**There are many, many logics:** propositional, first-order, higher-order, modal, temporal, intuitionistic, linear, non-monotonic, many-valued, ...

We will concentrate on a few, starting with propositional logic

# My God, it's full of logics!



**There are many, many logics:** propositional, first-order, higher-order, modal, temporal, intuitionistic, linear, non-monotonic, many-valued, ...

We will concentrate on a few, starting with **propositional logic**