

# **Formal Methods and Functional Programming**

## **Part II**

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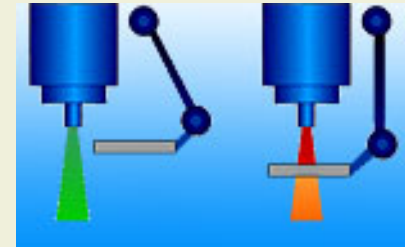
# Software Errors Cost Large Amounts of Money

- Software errors cost US economy \$59.5 billion annually (estimate by Department of Commerce's National Institute of Standards and Technology, 2002)
- Software bugs in baggage handling system of the airport of Denver lead to damage of around \$1 million per day (for almost a year)
- Explosion of Ariane 5 destroyed satellites worth \$500 million
- In comparison: famous hardware bugs:
  - Pentium bug cost Intel \$500 million
  - Xbox bug cost Microsoft \$1 billion



# Software Errors May Cost Lives

- Software error in Therac-25 medical linear accelerator lead to overdose, which killed six people
- Rounding error caused Patriot Missile system to ignore an incoming Scud missile; 28 soldiers died
- Many other safety critical systems
  - Controllers in airplanes, cars, trains, etc.
  - Air traffic control systems
  - Nuclear reactor control systems



# Traditional Software Engineering

- Describes expected behavior using **natural language** or **semi-formal notations**

- Ambiguities
- Contradictions
- Incompletenesses



- Relies on **testing** to ensure quality
  - *Testing can show the presence of errors, but not their absence.*  
[E. Dijkstra]
  - Exhaustive testing possible only for trivial programs
  - Some errors are hard to find (data races, deadlocks)
  - Achieving good test coverage is difficult (rare cases)

# Alternative: Formal Methods

Formal methods are mathematical approaches to software and system development which support the rigorous specification, design, and verification of computer systems.

[FME]

- Programs, programming languages, designs, etc. are **mathematical objects** and can be treated by **mathematical methods**
- Examples from Part I of the course:
  - Proving program properties

$$\forall x, y, z. (x ++ y) ++ z = x ++ (y ++ z)$$

- Formalizing language semantics

$$(\lambda x. M) N \hookrightarrow M[x \leftarrow N]$$

- Proving language properties

$$\text{If } e \hookrightarrow e' \text{ and } \vdash e :: \tau \text{ then } \vdash e' :: \tau$$

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void sort(int[] input)
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- `sort({2})` → `{2}` ✓
- `sort({2,3,1})` → `{1,2,3}` ✓
- `sort({2,2,1})` → `{1,2,1}` ✗

# Example 1: Sorting Function

```
void sort(int[] input)
```

- Informal specification:

Method sort sorts the elements of input in ascending order

- Testing

- $\text{sort}(\{\}) \rightarrow \{\}$  ✓
- $\text{sort}(\{2\}) \rightarrow \{2\}$  ✓
- $\text{sort}(\{2,3,1\}) \rightarrow \{1,2,3\}$  ✓
- $\text{sort}(\{2,2,1\}) \rightarrow \{1,2,1\}$  ✗
- $\text{sort}(\text{null}) \rightarrow \text{⚡}$  ✗

# Example 1: Sorting Function—Formal Treatment

- Specification
  - Pre and postcondition in predicate logic (contract)
  - If  $a$  is a **non-null array** of integers and in the **state before a call**  $\text{sort}(a)$ , the elements of  $a$  are  $e_0 \dots e_n$ , then **the call terminates** and immediately after the call, the elements of  $a$ ,  $e'_0 \dots e'_n$ , are **a permutation** of  $e_0 \dots e_n$  and  $\forall i, j \in [0, n]. i < j \Rightarrow e'_i \leq e'_j$ .

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- Verification
  - **Prove** that  $\text{sort}$  satisfies its specification using a **formal semantics of the programming language**
- Observations
  - Specification permits duplicate elements in array:  
Test  $\text{sort}(\{2, 2, 1\})$  reveals **error in implementation**
  - Specification excludes `null` from the valid arguments to  $\text{sort}$ :  
Test  $\text{sort}(\text{null})$  is an **invalid test case**
  - Correctness proof covers **all valid inputs**, not just selected test cases

## Example 2: Zune Bug



- Zune 30 did not work on Dec. 31, 2008
- Official fix: drain battery and recharge after midday on Jan. 01, 2009

```
//-----  
// Split total days since  
// Jan. 01, ORIGINYEAR  
// into year, month and day  
//-----  
BOOL ConvertDays(UINT32 days, ...) {  
    int year = ORIGINYEAR; /* =1980 */  
  
    while (days > 365) {  
        if (IsLeapYear(year)) {  
            if (days > 366) {  
                days -= 366; year += 1;  
            }  
        } else {  
            days -= 365; year += 1;  
        }  
    }  
    ... }  
}
```

## Example 2: Zune Bug—Formal Treatment

- Prove termination formally
- Repetition: Sufficient condition for termination of recursive functions:  
Arguments are **smaller along a well-founded order**
- Similar technique for loops
- Zune example:
  - Termination measure:  
variable days
  - Well-founded order:  $<$   
with lower bound 365  
(loop condition)
  - Error: measure not  
decreased if  
`IsLeapYear(year)`  
and `days==366`

```
while (days > 365) {  
    if (IsLeapYear(year)) {  
        if (days > 366) {  
            days -= 366; year += 1;  
        }  
    } else {  
        days -= 365; year += 1;  
    }  
}
```



# Example 3: Deadlock

- Threads are synchronized via locks
- Interleaved execution of `a.transfer(b,n)` and `b.transfer(a,m)` might **deadlock**
- Multi-threaded programs are **extremely hard to test**

```
class Account {  
    int balance;  
  
    void transfer(Account to, int amount) {  
        acquire this;  
        acquire to;  
        this.balance -= amount;  
        to.balance += amount;  
        release this;  
        release to;  
    }  
}
```

# Example 3: Deadlock—Formal Treatment (1)

- Prevent deadlocks by **acquiring locks in ascending order**
- **Prove absence of deadlocks** by:
  - Defining an order on locks
  - Proving for each acquire `o` that `o` is **above all other locks** held by the current thread

```
class Account {  
    int balance;  
    int number; // unique account number  
  
    void transfer(Account to, int amount) {  
        if (this.number < to.number) {  
            acquire this;  
            acquire to;  
        } else {  
            acquire to;  
            acquire this;  
        }  
        this.balance -= amount;  
        to.balance += amount;  
        release this;  
        release to;  
    }  
}
```

## Example 3: Deadlock—Formal Treatment (2)

- Alternative approach: state space exploration
  - Enumerate all possible states of a system
  - Check properties on the states and their transitions
  - Absence of deadlock: check for each state that there is a way to reach the terminal state

## Example 3: Deadlock—Formal Treatment (2)

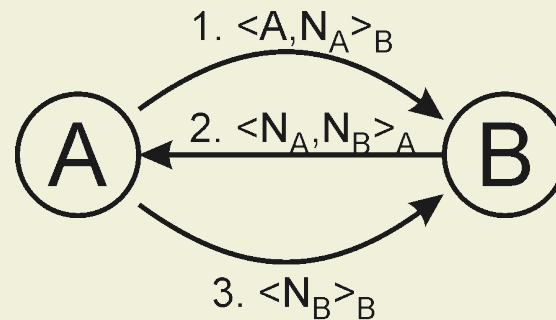
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- Main problem: size of state space
- Explore **abstractions** of real program (here, balance does not matter)
- Explore state space for **limited executions**
  - Small number of threads (here, two are sufficient)
  - Small number of objects (here, two are sufficient)
  - Small number of context switches (here, one is sufficient)

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- Explore **abstractions** of real program (here, balance does not matter)
- Explore state space for **limited executions**
  - Small number of threads (here, two are sufficient)
  - Small number of objects (here, two are sufficient)
  - Small number of context switches (here, one is sufficient)
- State space exploration typically gives **no correctness guarantee**
  - Similar to testing
  - Very effective in practice

# Example 4: Needham-Schroeder Protocol

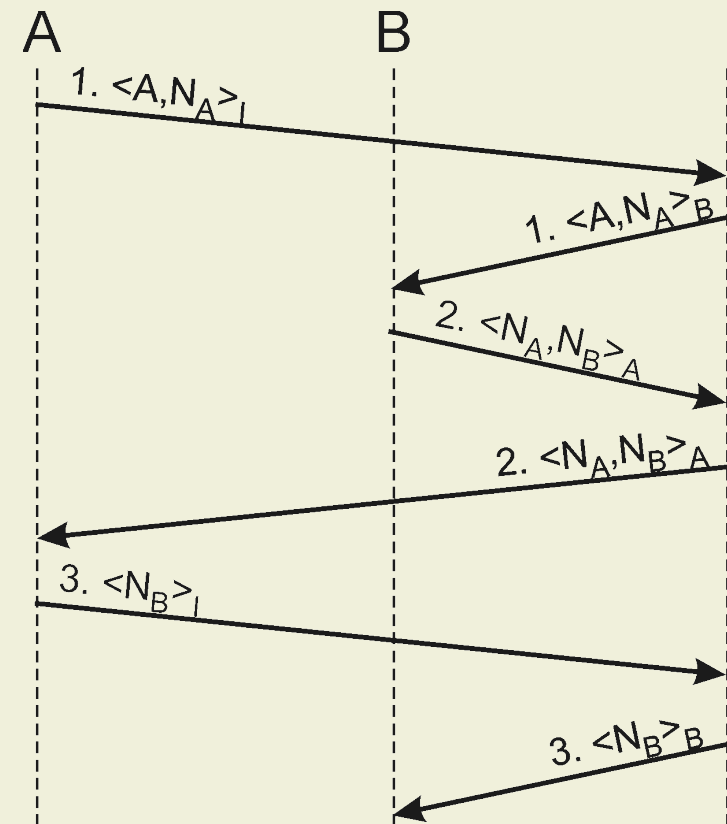
- Establish a common secret over an insecure channel
  - Alice sends random number  $N_A$  to Bob, encrypted with Bob's public key:  $\langle A, N_A \rangle_B$
  - Bob sends random number  $N_B$  to Alice, encrypted with Alice's public key:  $\langle N_A, N_B \rangle_A$
  - Alice responds with  $\langle N_B \rangle_B$



- Intruders may:
  - Intercept, store, and replay messages
  - Initiate or participate in runs of the protocol
  - Decrypt messages only if encrypted with intruder's public key
- Error: intruder can pretend to be another party

# Example 4: Needham-Schroeder Protocol— Formal Treatment

- State space exploration: **enumerate protocol runs**
  - Develop formal model of **intruder as non-deterministic program**
  - Simplifications: two agents, one intruder with limited memory
  - Check whether there is a protocol run such that agent believes to talk to other agent, but in fact **talks to intruder**
- Error was found this way 17 years after protocol was published



# Observations: Formal Specification

- Use mathematical notations to describe:
  - **Assumptions** about the environment (e.g., intruder model)
  - **Requirements** for the system (desired properties, e.g., deadlock freedom)
  - **System design** to accomplish these requirements (e.g., program code)



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  - **System design** to accomplish these requirements (e.g., program code)
- Requirements
  - **Safety properties**: Something bad will never happen
    - Functional behavior of sort
    - Absence of certain faults (e.g., buffer overflow)
  - **Liveness properties**: Something good will happen eventually
    - Termination of `ConvertDays`
    - Deadlock freedom of transfer
  - **Non-functional requirements**
    - Resource consumption, e.g., memory usage
    - Runtime, e.g., realtime guarantees

# Observations: Formal Verification

- Use formal logic to:
  - **Validate specifications** by checking consistency  
Example: termination measure uses well-founded order
  - **Prove** that design satisfies requirements under given assumptions  
Example: code does not deadlock
  - **Prove** that a more detailed design implements a more abstract one (refinement)  
Example: protocol implementation refines protocol specification

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Example: protocol implementation refines protocol specification
- **Proof method**
  - **Deductive**: proof system  
Example: prove termination in a program logic
  - **Algorithmic**: state space exploration (model checking)  
Example: enumerate and check protocol runs

# Formal Methods: Ingredients

- Specification language
  - Modeling or programming language with precise semantics
  - Desired properties expressed as logical formulas or abstract system
  - Precise meaning of “system satisfies property”
- Proof method
  - Method to establish or refute that a system satisfies a property
- Tool support
  - For specification and verification
  - Proofs are often simple, but tedious (in contrast to mathematics)
  - Tools needed to check details
  - Main examples: theorem provers and model checkers

# Benefits of Formal Methods

- Strong guarantees
  - Detect faults with **greater certainty** than testing
  - Guarantee **absence of specific faults**
  - **Unambiguous** communication and documentation

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- Universality
  - Programs (e.g., termination proof)
  - Software designs (e.g., protocol verification)
  - Programming languages (e.g., type safety proof)
  - Hardware (e.g., refinement proof between gate and transistor design)

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  - Software designs (e.g., protocol verification)
  - Programming languages (e.g., type safety proof)
  - Hardware (e.g., refinement proof between gate and transistor design)
- Didactic value: Studying formal methods:
  - Leads to **deep understanding of semantics** of programs, design specifications, etc.
  - Increases awareness of **subtle issues** of programs, languages, etc.
  - **Makes you a better engineer!**

# Success Stories

- Paris driverless metro (Meteor)
  - Safety-critical system
  - Pilot software developed through stepwise refinement in B
  - Most detailed design translated automatically to 30,000 lines of Ada
  - 28,000 proofs



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  - Third-party device drivers not respecting APIs responsible for 90% of Windows crashes
  - SLAM inspects C code using a combination of model checking and theorem proving
- Airbus 380 flight controller
  - Safety-critical system
  - Static analysis of 500,000 lines of C code
  - Proved absence of runtime errors (e.g., buffer overflows)

# Limitations

- Incorrect specifications
  - Formal methods per se **do not guarantee correctness**
  - Verifying the wrong specification is useless
  - It is difficult to get specifications right
- Technical limitations
  - Almost all interesting properties are **undecidable**
  - Many tools quickly reach limits (scope, computing resources)
- Most formal methods require **specialist users**
  - Strong background in mathematics
  - Training in formal modelling
- Application of formal methods is **expensive**
  - But testing is expensive, too

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- Testing still necessary
  - Validate specifications
  - Test properties not formally proven (e.g., performance)
  - Detect errors in environment (e.g., compiler)
- Formal methods aid testing
  - Derive test cases, test data, and test oracles from specifications
  - Increase test coverage
  - Replace (infinitely) many tests

# Course Outline—Part II

- Focus: formal methods for (stateful) software
  - Imperative programs and languages
  - Software designs

## 1. Formal semantics of programming languages

- Operational semantics
- Hoare logic

## 2. State space exploration

- Temporal logic
- Model checking

# Organization

- Most aspects do not change (web page, homework)
- Different tutors
  - Tuesday 16-18, IFW C42 (Alex Summers, English)
  - Tuesday 16-18, IFW B42 (Yannis Kassios, English)
  - Tuesday 16-18, IFW A34 (Malte Schwerhoff, German)
  - Wednesday 15-17, IFW A32.1 (Alex Summers, English)
  - Wednesday 15-17, IFW B42 (Yannis Kassios, English)

Please attend the same session as in the first half of the course

- Homework can be submitted in one of two ways:
  - By email to the appropriate tutor
  - By hand in the appropriate box outside room RZ F1

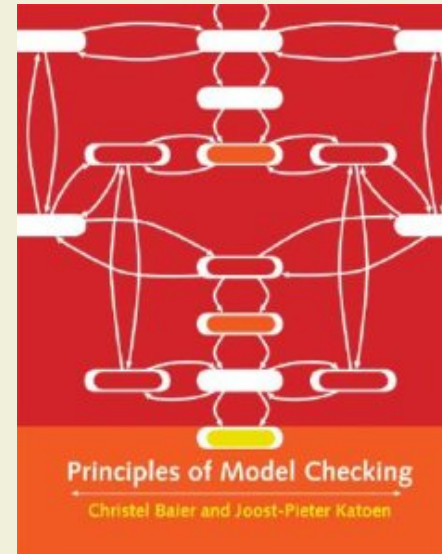
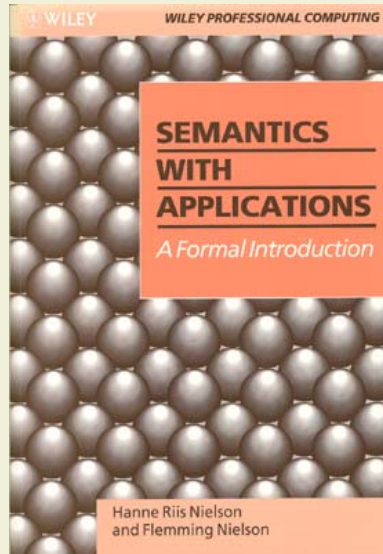
Solutions must be received by 9:15 on the Monday after the exercise is published, in order to receive feedback.



# Exam

- The final exam will take place on Thursday, [June 10, 2010](#), 9:00–11:00
  - See web page for details
- The grade in the course will be determined based on the average points received in the midterm and the final exam.
- We offer a Q&A session in the very last lecture
  - Thursday, June 03, 10:00 - 12:00 in HG F 7

# Recommended Books



- Hanne Riis Nielson and Flemming Nielson:  
*Semantics with Applications: A Formal Introduction*
  - Available from  
[http://www.daimi.au.dk/~bra8130/Wiley\\_book/wiley.pdf](http://www.daimi.au.dk/~bra8130/Wiley_book/wiley.pdf)
- Christel Baier and Joost-Pieter Katoen:  
*Principles of Model Checking*

# 1. Introduction to Language Semantics

1.1 Motivation

1.2 Overview

1.3 The Language IMP

1.4 Semantics of Expressions

1.5 Properties of the Semantics

# C: Expression Evaluation

```
int print(char* text) {  
    printf("%s\n", text);  
    return 5;  
}
```

```
print("One")+print("Two");
```

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```
print("One")+print("Two");
```

One  
Two

Two  
One

In C and C++,  
**evaluation order** of  
expressions is **undefined**

- Precedence and associativity define rules for structuring expressions
- But do not define operand evaluation order

# Haskell and SML: Evaluation

## Haskell

```
const :: Int -> Int  
const x = 1
```

```
const ( 2 'div' 0 )
```

## SML

```
fun const (x: int):int = 1;
```

```
const ( 2 div 0 );
```

# Haskell and SML: Evaluation

## Haskell

```
const :: Int -> Int  
const x = 1
```

```
const ( 2 'div' 0 )
```

```
1
```

## SML

```
fun const (x: int):int = 1;
```

```
const ( 2 div 0 );
```

```
uncaught exception divide by zero
```

- Haskell uses **lazy evaluation**:  
Arguments are evaluated when they are needed
- SML uses **eager evaluation**:  
Arguments are evaluated when function is applied

# Java: Dynamic Method Binding

```
class C1 {  
    int x;  
    public void inc1( )  
        { this.inc2( ); }  
    private void inc2( )  
        { x++; }  
}
```

```
class CS1 extends C1 {  
    public void inc2( )  
        { inc1( ); }  
}
```

```
CS1 cs = new CS1(5);  
cs.inc2( );  
System.out.println(cs.x);
```



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```
CS1 cs = new CS1(5);  
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```

```
class C2 {  
    int x;  
    public void inc1( )  
        { this.inc2( ); }  
    protected void inc2( )  
        { x++; }  
}
```

```
class CS2 extends C2 {  
    public void inc2( )  
        { inc1( ); }  
}
```

```
CS2 cs = new CS2(5);  
cs.inc2( );  
System.out.println(cs.x);
```

# Java: Class Initialization

```
class C {  
    public static int x;  
}
```

```
class D {  
    public static char y;  
    ...  
}
```

```
C.x = 0;  
D.y = '?';  
System.out.println(C.x);
```

# Java: Class Initialization

```
class C {  
    public static int x;  
}
```

```
class D {  
    public static char y;  
  
    static { C.x = C.x + 1; }  
}
```

```
C.x = 0;  
D.y = '?';  
System.out.println(C.x);
```

1

# Why Formal Semantics?

- Programming language design
  - Formal verification of language properties
  - Reveal ambiguities
  - Support for standardization
- Implementation of programming languages
  - Compilers
  - Interpreters
  - Portability
- Reasoning about programs
  - Formal verification of program properties
  - Extended static checking

# Language Properties

- **Type safety:**

In each execution state, a variable of type  $T$  holds a value of  $T$  or a subtype of  $T$

- Very important question for language designers

- Example:

If `String` is a subtype of `Object`, should `String[]` be a subtype of `Object[]`?

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- Example:

If `String` is a subtype of `Object`, should `String[]` be a subtype of `Object[]`?

```
void m(Object[] oa) {  
    oa[0]=new Integer(5);  
}
```

```
String[] sa=new String[10];  
m(sa);  
String s = sa[0];
```

# Compiler Optimization

- Common subexpression elimination

```
d = a * Math.sqrt(c);  
e = b * Math.sqrt(c);
```

```
double tmp=Math.sqrt(c);  
d = a * tmp;  
e = b * tmp;
```

# Compiler Optimization

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d = a * tmp;  
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```

- Optimization works only for side-effect free expressions

```
d = a * c++;  
e = b * c++;
```

```
double tmp = c++;  
d = a * tmp;  
e = b * tmp;
```



# Formal Verification

```
/* returns the  
   factorial of n */  
int fac(int n) {  
    if (n>1)  
        return n*fac(n-1);  
    else  
        return 1;  
}
```

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```

fac(17);

-288522240

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}
```

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-288522240

- Verification could run by induction
- Induction hypothesis:  
 $n \geq 0 \Rightarrow \text{fac}(n) = n!$
- Induction base is trivial
- Induction step requires to prove  $n \times (n-1)! = n!$  which is not the case in computer arithmetic

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# Language Definition

Dynamic Semantics

- State of a program execution
- Transformation of states

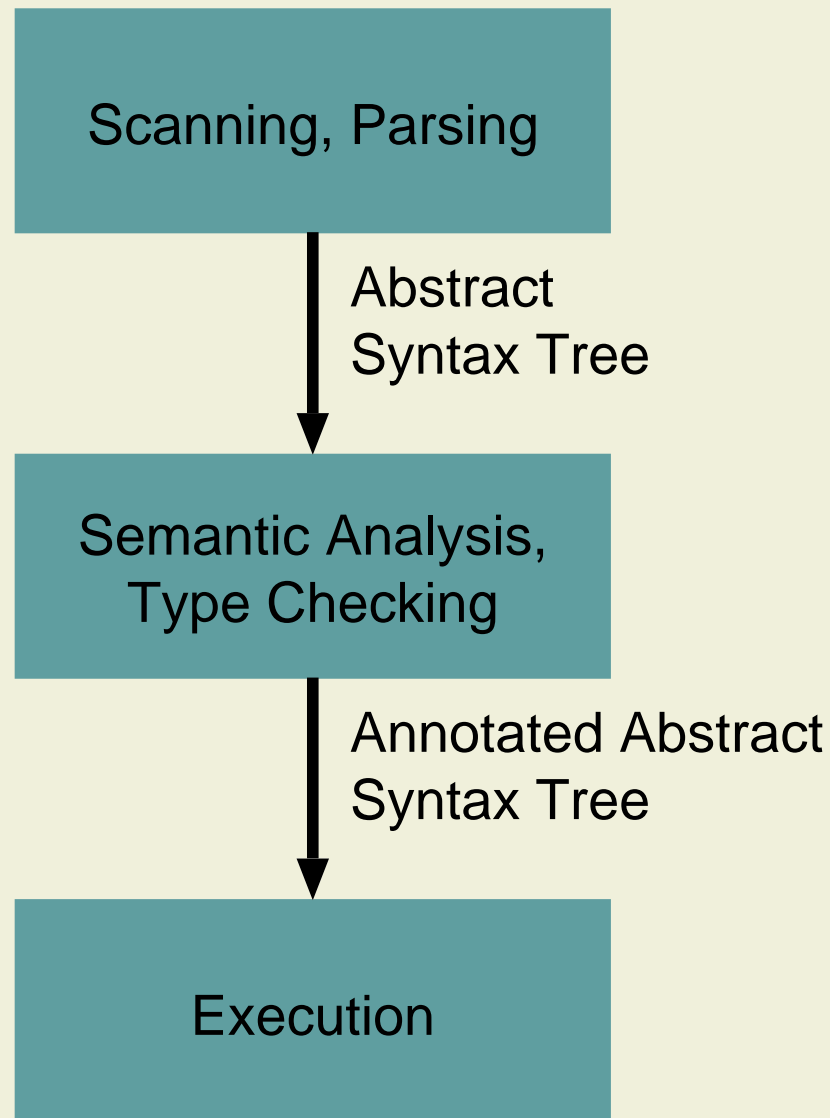
Static Semantics

- Type rules
- Name resolution

Syntax

- Syntax rules, defined by grammar

# Compilation and Execution



# Three Kinds of Semantics

- Operational semantics
  - Describes execution on an **abstract machine**
  - Describes **how** the effect is achieved
- Denotational semantics
  - Programs are regarded as **functions** in a mathematical domain
  - Describes **only the effect**, not how it is obtained
- Axiomatic semantics
  - **Specific properties** of the effect of executing a program are expressed
  - Some aspects of the computation may be **ignored**

# Operational Semantics

```
y := 1;  
while not(x=1) do ( y := x*y; x := x-1 )
```

- “First we assign 1 to  $y$ , then we test whether  $x$  is 1 or not. If it is then we stop and otherwise we update  $y$  to be the product of  $x$  and the previous value of  $y$  and then we decrement  $x$  by 1. Now we test whether the new value of  $x$  is 1 or not...”
- Two kinds of operational semantics
  - Natural Semantics
  - Structural Operational Semantics



# Denotational Semantics

```
y := 1;  
while not(x=1) do ( y := x*y; x := x-1 )
```

- “For input values of  $x$  greater than 0, the program computes a partial function from states to states: the final state will be equal to the initial state except that the value of  $x$  will be 1 and the value of  $y$  will be equal to the factorial of the value of  $x$  in the initial state”
- Two kinds of denotational semantics
  - Direct Style Semantics
  - Continuation Style Semantics

# Axiomatic Semantics

```
y := 1;  
while not(x=1) do ( y := x*y; x := x-1 )
```

- “If  $x = n$  holds before the program is executed then  $y = n!$  will hold when the execution terminates (if it terminates)”
- Two kinds of axiomatic semantics
  - Partial correctness
  - Total correctness

# Abstraction

Concrete language implementation

Operational semantics

Denotational semantics

Axiomatic semantics

Abstract description

# Selection Criteria

## Constructs of the language

- Imperative
- Functional
- Concurrent
- Object-oriented
- Non-deterministic
- Etc.

## Application of the semantics

- Understanding the language
- Program verification
- Prototyping
- Compiler construction
- Program analysis
- Etc.

# Focus of this Course

- We discuss the major approaches to semantics for a small imperative language IMP
  - Similarities and differences
  - Important theoretical results
- Operational Semantics
  - Natural and structural operational semantics of IMP
  - Equivalence
- Axiomatic Semantics
  - Axiomatic semantics of IMP
  - Soundness and completeness

# 1. Introduction to Language Semantics

1.1 Motivation

1.2 Overview

1.3 The Language IMP

1.4 Semantics of Expressions

1.5 Properties of the Semantics

# The Language IMP

- Expressions
  - Boolean and arithmetic expressions
  - No side-effects in expressions
- Variables
  - All variables range over integers
  - All variables are initialized
- IMP does not include
  - Heap allocation and pointers
  - Variable declarations
  - Procedures
  - Concurrency

# Syntax of IMP: Characters and Tokens

## Characters

Letter = 'A' | ... | 'Z' | 'a' | ... | 'z'

Digit = '0' | '1' | '2' | '3' | '4' | '5' | '6' | '7' | '8' | '9'

## Tokens

Ident = Letter { Letter | Digit }

Numeral = Digit | Numeral Digit

Var = Ident



# Syntax of IMP: Expressions

## Arithmetic expressions

$$\begin{aligned} \text{Aexp} &= '(' \text{ Aexp Op Aexp } ')' \mid \text{Var} \mid \text{Numeral} \\ \text{Op} &= '+' \mid '-' \mid '*' \end{aligned}$$

## Boolean expressions

$$\begin{aligned} \text{Bexp} &= '(' \text{ Bexp 'or' Bexp } ')' \mid '(' \text{ Bexp 'and' Bexp } ')' \\ &\mid \text{'not' Bexp} \mid \text{Aexp RelOp Aexp} \\ \text{RelOp} &= '=' \mid \text{'\#'} \mid '<' \mid '<=' \mid '>' \mid '>=' \end{aligned}$$

We omit parentheses if permitted by the usual operator precedence

# Syntax of IMP: Statemens

```
Stm  = 'skip'
      | Var ':=' Aexp
      | Stm ';' Stm
      | 'if' Bexp 'then' Stm 'else' Stm 'end'
      | 'while' Bexp 'do' Stm 'end'
```

# Notation

Meta-variables (written in *italic* font)

$x, y, z$	for variables (Var)
$e, e', e_1, e_2$	for arithmetic expressions (Aexp)
$b, b_1, b_2$	for boolean expressions (Bexp)
$s, s', s_1, s_2$	for statements (Stm)

Keywords are written in typewriter font

# Syntax of IMP: Example

```
res := 1;  
while n > 1 do  
    res := res * n;  
    n := n - 1  
end
```

# 1. Introduction to Language Semantics

1.1 Motivation

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1.3 The Language IMP

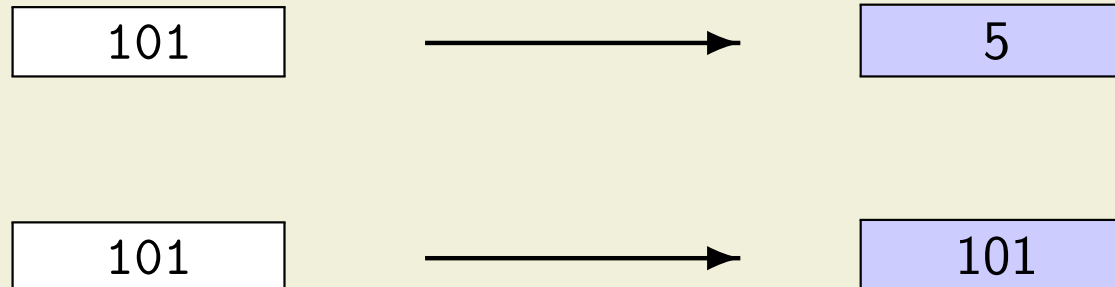
1.4 Semantics of Expressions

1.5 Properties of the Semantics

# Semantic Categories

Syntactic category: Numeral

Semantic category:  $\text{Val} = \mathbb{Z}$



- Semantic functions map elements of syntactic categories to elements of semantic categories
- To define the semantics of IMP, we need semantic functions for
  - Numerals (syntactic category Numeral)
  - Arithmetic expressions (syntactic category Aexp)
  - Boolean expressions (syntactic category Bexp)
  - Statements (syntactic category Stm)

# Semantics of Numerals

The semantic function

$$\mathcal{N} : \text{Numeral} \rightarrow \text{Val}$$

maps a numeral  $n$  to an integer value  $\mathcal{N}[[n]]$

$$\mathcal{N}[[0]] = 0$$

...

$$\mathcal{N}[[8]] = 8$$

$$\mathcal{N}[[n\ 0]] = \mathcal{N}[[n]] \times 10 + 0$$

...

$$\mathcal{N}[[n\ 8]] = \mathcal{N}[[n]] \times 10 + 8$$

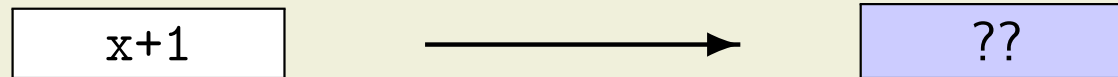
$$\mathcal{N}[[1]] = 1$$

$$\mathcal{N}[[9]] = 9$$

$$\mathcal{N}[[n\ 1]] = \mathcal{N}[[n]] \times 10 + 1$$

$$\mathcal{N}[[n\ 9]] = \mathcal{N}[[n]] \times 10 + 9$$

# States



- The meaning of an expression depends on the values bound to the variables that occur in it
- A state associates a value to each variable

State :  $\text{Var} \rightarrow \text{Val}$

- We represent a state  $\sigma$  as a finite function

$$\sigma = \{x_1 \mapsto v_1, x_2 \mapsto v_2, \dots, x_n \mapsto v_n\}$$

where  $x_1, x_2, \dots, x_n$  are different elements of  $\text{Var}$  and  $v_1, v_2, \dots, v_n$  are elements of  $\text{Val}$ .



# Semantics of Arithmetic Expressions

The semantic function

$$\mathcal{A} : \text{Aexp} \rightarrow \text{State} \rightarrow \text{Val}$$

maps an arithmetic expression  $e$  and a state  $\sigma$  to a value  $\mathcal{A}[[e]]\sigma$

$$\begin{aligned}\mathcal{A}[[x]]\sigma &= \sigma(x) \\ \mathcal{A}[[n]]\sigma &= \mathcal{N}[[n]] \\ \mathcal{A}[[e_1 \text{ op } e_2]]\sigma &= \mathcal{A}[[e_1]]\sigma \ \overline{\text{op}} \ \mathcal{A}[[e_2]]\sigma \quad \text{for } \text{op} \in \text{Op}\end{aligned}$$

$\overline{\text{op}}$  is the operation  $\text{Val} \times \text{Val} \rightarrow \text{Val}$  corresponding to  $\text{op}$

# Semantics of Boolean Expressions

The semantic function

$$\mathcal{B} : \text{Bexp} \rightarrow \text{State} \rightarrow \text{Bool}$$

maps a boolean expression  $b$  and a state  $\sigma$  to a truth value  $\mathcal{B}[[b]]\sigma$

$$\mathcal{B}[[e_1 \text{ op } e_2]]\sigma = \begin{cases} tt & \text{if } \mathcal{A}[[e_1]]\sigma \overline{\text{op}} \mathcal{A}[[e_2]]\sigma \\ ff & \text{otherwise} \end{cases}$$

$\text{op} \in \text{RelOp}$  and  $\overline{\text{op}}$  is the relation  $\text{Val} \times \text{Val}$  corresponding to  $\text{op}$

# Boolean Expressions (cont'd)

$$\mathcal{B}[[b_1 \text{ or } b_2]]\sigma = \begin{cases} tt & \text{if } \mathcal{B}[[b_1]]\sigma = tt \text{ or } \mathcal{B}[[b_2]]\sigma = tt \\ ff & \text{otherwise} \end{cases}$$

$$\mathcal{B}[[b_1 \text{ and } b_2]]\sigma = \begin{cases} tt & \text{if } \mathcal{B}[[b_1]]\sigma = tt \text{ and } \mathcal{B}[[b_2]]\sigma = tt \\ ff & \text{otherwise} \end{cases}$$

$$\mathcal{B}[[\text{not } b]]\sigma = \begin{cases} tt & \text{if } \mathcal{B}[[b]]\sigma = ff \\ ff & \text{otherwise} \end{cases}$$

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# Well-Founded Relations

- Definition

A binary relation  $<$  on a set  $A$  is *well-founded* iff there are no infinite descending chains

$$\dots < a_j < \dots < a_1 < a_0$$

- Examples

$<$  is a well-founded relation on  $\mathbb{N}$

$<$  is not well-founded on  $\mathbb{Z}$

$\leq$  is not well-founded on  $\mathbb{N}$

- Well-founded relations are also called Noetherian orders

# Well-Founded Induction

- Principle of well-founded induction

Let  $<$  be a well-founded relation on a set  $A$ . Let  $P$  be a property. Then the following equivalence holds.

$$\begin{aligned} & (\forall a \in A : ((\forall b \in A : b < a \Rightarrow P(b)) \Rightarrow P(a))) \\ & \Leftrightarrow \forall a \in A : P(a) \end{aligned}$$

- Mathematical induction is a special case of well-founded induction
  - Set:  $\mathbb{N}$
  - Relation:  $n < m$  iff  $m = n + 1$
- Structural induction is a special case of well-founded induction
  - Set: the set of terms of an algebraic data type
  - Relation:  $n < m$  iff  $n$  is a (proper) sub-term of  $m$

# Structural Induction: Example

- Syntax defined as algebraic data type

$$\text{Aexp} = ' (' \text{ Aexp Op Aexp } ') ' \mid \text{Var} \mid \text{Numeral}$$

- Constructors are left implicit
- Structural induction for arithmetic expressions

$$\begin{aligned} & (\forall n \in \text{Numeral} : P(n)) \wedge \\ & (\forall x \in \text{Var} : P(x)) \wedge \\ & (\forall e_1, e_2 \in \text{Aexp} : P(e_1) \wedge P(e_2) \Rightarrow P(e_1 \text{ op } e_2)) \\ & \Leftrightarrow \\ & \forall e \in \text{Aexp} : P(e) \end{aligned}$$

# Inductive Definitions

The semantics is given by **recursive definitions** of functions

- The values for the basis elements are defined directly
- The values for composite elements are defined **inductively** in terms of the immediate constituents

$$\begin{array}{ll} \mathcal{A}[[x]]\sigma & = \sigma(x) \\ \mathcal{A}[[n]]\sigma & = \mathcal{N}[[n]] \\ \mathcal{A}[[e_1 \text{ op } e_2]]\sigma & = \mathcal{A}[[e_1]]\sigma \overline{\text{op}} \mathcal{A}[[e_2]]\sigma \quad \text{for } \text{op} \in \text{Op} \end{array}$$

- Since the decomposition of the elements is unique this means that the semantics is well-defined
- Inductive definitions enable proofs by structural induction



# Using Structural Induction

- Lemma: The equations for  $\mathcal{N}$  define a total function  $\mathcal{N} : \text{Numeral} \rightarrow \text{Val}$
- To prove the lemma, we show that for each  $n \in \text{Numeral}$  there is exactly one  $v \in \text{Val}$  such that  $\mathcal{N}[[n]] = v$
- $\mathcal{N}$  is defined inductively:

$\mathcal{N}[[0]] = 0$	$\mathcal{N}[[1]] = 1$
...	
$\mathcal{N}[[8]] = 8$	$\mathcal{N}[[9]] = 9$
$\mathcal{N}[[n\ 0]] = \mathcal{N}[[n]] \times 10 + 0$	$\mathcal{N}[[n\ 1]] = \mathcal{N}[[n]] \times 10 + 1$
...	
$\mathcal{N}[[n\ 8]] = \mathcal{N}[[n]] \times 10 + 8$	$\mathcal{N}[[n\ 9]] = \mathcal{N}[[n]] \times 10 + 9$

- Therefore, we can prove the lemma by structural induction on  $n$

# Proof: $\mathcal{N}$ is a Total Function

## 1. Induction base: all terms of height 1 (digits)

There are ten cases for the induction base for the ten different digits.  
 $\mathcal{N}$  maps each digit to exactly one value in Val.

## 2. Induction step: $n \equiv n_1 d$ for some digit $d$

There are ten cases for the induction step. Here, we show the case for a digit  $d$

- $n_1$  is a sub-term of  $n$
- By applying the induction hypothesis to  $n_1$ , we get:  
(a) there is exactly one  $v_1 \in \text{Val}$  such that  $\mathcal{N}[[n_1]] = v_1$
- The equations for  $\mathcal{N}$  define  $\mathcal{N}[[n_1 d]] = \mathcal{N}[[n_1]] \times 10 + v_d$  where  $v_d$  is the integer value for digit  $d$ . (b) There is exactly one such  $v_d$
- By using (a) and (b), we get that there is exactly one pair of values  $v_1, v_d \in \text{Val}$  such that  $\mathcal{N}[[n_1 d]] = v_1 \times 10 + v_d$
- Since multiplication and addition are total functions, we can conclude that there is exactly one value for  $v_1 \times 10 + v_d$  and, thus, for  $\mathcal{N}[[n_1 d]]$

# $\mathcal{A}$ is a Total Function

- Lemma: The equations for  $\mathcal{A}$  define a total function  $\mathcal{A} : \text{Aexp} \rightarrow \text{State} \rightarrow \text{Val}$
- To prove the lemma, we show that for each  $e \in \text{Aexp}$  and  $\sigma \in \text{State}$  there is exactly one  $v \in \text{Val}$  such that  $\mathcal{A}[[e]]\sigma = v$
- $\mathcal{N}$  is defined inductively:

$$\begin{aligned}\mathcal{A}[[x]]\sigma &= \sigma(x) \\ \mathcal{A}[[n]]\sigma &= \mathcal{N}[[n]] \\ \mathcal{A}[[e_1 \text{ op } e_2]]\sigma &= \mathcal{A}[[e_1]]\sigma \overline{\text{op}} \mathcal{A}[[e_2]]\sigma \quad \text{for } \text{op} \in \text{Op}\end{aligned}$$

- Therefore, we can prove the lemma by structural induction on  $e$

# Proof: $\mathcal{A}$ is a Total Function

## 1. Induction base: all terms of height 1

- Case 1:  $e \equiv n$

The equations define  $\mathcal{A}[[n]]\sigma = \mathcal{N}[[n]]$ . According to the previous lemma,  $\mathcal{N}$  is a total function and, thus,  $\mathcal{N}[[n]]$  yields exactly one value in  $\text{Val}$

- Case 2:  $e \equiv x$

The equations define  $\mathcal{A}[[x]]\sigma = \sigma(x)$ .  $\sigma$  is a total function,  $\sigma(x) \in \text{Val}$

## 2. Induction step: $e \equiv e_1 \text{ op } e_2$

- $e_1$  and  $e_2$  are sub-terms of  $e$
- By applying the induction hypothesis to  $e_1$  and  $e_2$ , we get:
  - (a) there is exactly one  $v_1 \in \text{Val}$  such that  $\mathcal{A}[[e_1]]\sigma = v_1$  and
  - (b) there is exactly one  $v_2 \in \text{Val}$  such that  $\mathcal{A}[[e_2]]\sigma = v_2$  and
- The equations for  $\mathcal{A}$  define  $\mathcal{A}[[e_1 \text{ op } e_2]]\sigma = \mathcal{A}[[e_1]]\sigma \overline{\text{op}} \mathcal{A}[[e_2]]\sigma$
- By using (a) and (b), we get that there is exactly one pair of values  $v_1, v_2 \in \text{Val}$  such that  $\mathcal{A}[[e_1 \text{ op } e_2]]\sigma = v_1 \overline{\text{op}} v_2$
- Since  $\overline{\text{op}}$  is a total function (addition, subtraction, or multiplication), we can conclude that there is exactly one value for  $v_1 \overline{\text{op}} v_2$  and, thus, for  $\mathcal{A}[[e_1 \text{ op } e_2]]\sigma$

# Inductive Definitions: Example

New arithmetic expression:  $-e$

- Inductive definition of  $\mathcal{A}[-e]\sigma$

$$\mathcal{A}[-e]\sigma = 0 - \mathcal{A}[e]\sigma$$

- $e$  is a **subterm** of  $-e$
- For the induction step we **may assume the induction hypothesis** for  $e$

- Non-inductive definition of  $\mathcal{A}[-e]\sigma$

$$\mathcal{A}[-e]\sigma = \mathcal{A}[0-e]\sigma$$

- $0-e$  is **not a subterm** of  $-e$
- For the induction step we **may not assume the induction hypothesis** for  $0-e$

# Free Variables

## Arithmetic expressions

$$\begin{aligned}FV(e_1 \text{ op } e_2) &= FV(e_1) \cup FV(e_2) \\FV(n) &= \emptyset \\FV(x) &= \{x\}\end{aligned}$$

## Boolean expressions

$$\begin{aligned}FV(b_1 \text{ op } b_2) &= FV(b_1) \cup FV(b_2), \text{ op} \in \text{RelOp} \\FV(\text{not } b) &= FV(b) \\FV(b_1 \text{ or } b_2) &= FV(b_1) \cup FV(b_2) \\FV(b_1 \text{ and } b_2) &= FV(b_1) \cup FV(b_2)\end{aligned}$$

## Statements

$$\begin{aligned}FV(\text{skip}) &= \emptyset \\FV(x := e) &= \{x\} \cup FV(e) \\FV(s_1 ; s_2) &= FV(s_1) \cup FV(s_2) \\FV(\text{if } b \text{ then } s_1 \text{ else } s_2 \text{ end}) &= FV(b) \cup FV(s_1) \cup FV(s_2) \\FV(\text{while } b \text{ do } s \text{ end}) &= FV(b) \cup FV(s)\end{aligned}$$

# Syntactic Abbreviations

```
if  $b$  then  $s$  end
```

```
if  $b$  then  $s$  else skip end
```

```
repeat  $s$  until  $b$ 
```

```
 $s$ ; while not  $b$  do  $s$  end
```

```
for  $x := e_1$  to  $e_2$  do  $s$  end
```

```
 $x \notin FV(e_2), y \notin FV(s)$ 
```

```
 $x := e_1$ ;  
var  $y := e_2$  in  
  while  $x \leq y$  do  
     $s; x := x + 1$   
  end  
end
```

```
true
```

```
1=1
```