# Software Verification : Introduction

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# What is Algorithmic Verification?

Algorithms, Techniques and Tools to ensure that

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- Programs
- Don't Have
- Bugs

(What does that *mean*? Stay tuned...)

Most people here know what it means so more concretely...

- 1. Survey of *basics* of software verification [me]
- 2. Building up to refinement type-based verification [me]

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3. Culminating with recent topics in verification. [you]

 $1. \ \mbox{Train students in state of the art, preparation for research}$ 

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2. Write a monograph synthesizing different lines of work

- 1. Use tools for different languages to see ideas in practice
- 2. Develop ideas in a single, unified, simplified (aka "toy") PL

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# Plan

- Part 1 Deductive Verification
- Part 2 Type Systems
- Part 3 Refinement Types
- Part 4 Abstract Interpretation
- Part 5 Heap and Dynamic Languages

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Part 6 Project Talks

## Plan: 1 Deductive Verification

Logics & Decision Procedures

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- Floyd-Hoare Logic
- Verification Conditions
- Symbolic Execution

# Plan: 2 Type Systems

- Hindley-Milner
- Subtyping
- Bidirectional Type Checking

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# Plan: 3 Refinement Types

Combining Types & Logic

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- Reasoning about State
- Abstract Refinements

### Plan: 4 Abstract Interpretation

- Horn Clause Constraints
- Galois Connections
- Predicate Abstraction/Liquid Types

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Interpolation

# Plan: 5 Heap & Dynamic Languages

- Linear Types
- Separation Logic
- Hoare Type Theory
- Dependent JavaScript

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### Plan: 6 Project Talks

Link to README



## Requirements & Evaluation

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- 1. Scribe
- 2. Program
- 3. Present

### Requirements: 1. Scribe

- Lectures will be black-board (not slides)
- You sign up for one lecture (Online URL)
- For that lecture, take notes
- Write up notes in LaTeX using provided template

About three "programming" assignments

- Implement some of algorithms (in Haskell)
- Use some verification tools (miscellaneous)

You will present one 40 minute talk

- 1. Select 1-3 (related) papers from reading list
- 2. Select presentation date (~ last 5 lectures)
- 3. Prepare slides, get vetted by me  $\mathbf{1}$  week in advance

- 4. Present lecture
- Can add other paper if I'm ok with it.

# Questions

# Lets Begin ...

- Logics & Decision Procedures
- Easily enough to teach (many) courses
- We will scratch the surface just to give a feel

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### Logic is the Calculus of Computation

- May seem abstract now ...
- ... why are we talking about these wierd symbols?!
- Much/all of program analysis can be boiled down to logic

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Language for reasoning about programs

We will look very closely at the following

- 1. Propositional Logic
- 2. Theory of *Equality*
- 3. Theory of Uninterpreted Functions
- 4. Theory of Difference-Bounded Arithmetic

(Why? Representative & have "efficient" decision procedures)

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(Why? Representative & have "efficient" decision procedures)

# **Propositional Logic**

A logic is a language

► Syntax of formulas (predicates, propositions...) in the logic

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Semantics of when are formulas satisfied or valid

## Propositional Logic: Syntax

```
data Symbol -- a set of symbols
```

Predicates are made of

Propositional symbols ("boolean variables")

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Combined with And, Or and Not

Propositional Logic: Syntax

```
data Symbol -- a set of symbols
```

Can build in other operators Implies, Iff, Xor etc.

p 'imp' q = (Not p 'Or' q)
p 'iff' q = (p 'And' q) 'Or' (Not p 'And' Not q)
p 'xor' q = (p 'And' Not q) 'Or' (Not p 'And' q)

Propositional Logic: Semantics

Predicate is a constraint. For example,

x1 'xor' x2 'xor' x3

States "only an odd number of the variables can be true"

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When is such a constraint satisfiable or valid ?

Propositional Logic: Semantics

Let Values = True, False, ... be a universe of possible "meanings"

An **assignment** is a map setting *value* of each Symbol as True or False

data Asgn = Symbol -> Value

### Semantics/Evaluation Procedure

Defines when an assignment s makes a formula p true.

```
eval :: Asgn -> Pred -> Bool

eval s (PV x) = s x -- assignment s s

eval s (Not p) = not (sat s p) -- p is NOT satis

eval s (p 'And' q) = sat s p && sat s q -- both of p , q a

eval s (p 'Or' q) = sat s p || sat s q -- one of p , q a
```

Propositional Logic: Decision Problem

Decision Problem: Satisfaction

Does eval s p return True for some assignment s ?

Decision Problem: Validity

Does eval s p return True for all assignments s ?

### Satisfaction: A Naive Decision Procedure

Does eval s p return True for **some** assignment s ? *Enumerate* all assignments and run eval on each!

```
isSat :: Pred -> Bool
isSat p = exists (\s -> eval s p) ss
where
   ss = asgns $ removeDuplicates $ vars p
exists f [] = False
exists f (x:xs) = f x || exists f xs
```

### Satisfaction: A Naive Decision Procedure

Does eval s p return True for **some** assignment s ?

Enumerate all assignments and run eval on each!

Enumerating all Assignments

asgns	:: [PVar] -> [Asgn]
asgns []	= $[\langle x - \rangle False]$
asgns (x:xs)	= [ext s x t   s <- asgns xs, t <- [True,
ext s x t	= $y \rightarrow if y == x$ then t else s x
vars	:: Pred -> [PVar]
vars ( <mark>PV</mark> x)	= [x]
vars ( <mark>Not</mark> p)	= vars p
vars (p 'And' q)	= vars p ++ vars q
vars (p'Or' q)	= vars p ++ vars q

**Obviously Inefficent**... (guaranteed) exponential in < => = <?</p>

We will look very closely at the following

- 1. Propositional Logic
- 2. Propositional Logic + Theories
  - Equality
  - Uninterpreted Functions
  - Difference-Bounded Arithmetic

(Why? Representative & have "efficient" decision procedures)

## Propositional Logic + Theory

Layer theories on top of basic propositional logic

Expressions

A new kind of term

data Expr

Theory

A Theory is Described by

- 1. Extend universe of Values
- 2. A set of Operator
  - Syntax : data Expr = ... | Op [Expr]
  - Semantics : eval :: Op -> [Value] -> Value
- 3. A set of Relation (i.e. [Expr] -> Pred)
  - Syntax : data Pred = ... | Symbol <=> (Rel [Expr])
  - Semantics eval .. Bel [Value] Bool

### Propositional Logic + Theory

Layer theories on top of basic propositional logic

Semantics

Extend eval semantics for Operator and Relation

eval s (op es) = eval op [eval s e | e <- es] eval s (x <=> r es) = eval r [eval s e | e <- es] ->

### Satisfaction / Validity

- Sat Does eval s p return True for some assignment s ?
- ▶ Valid Does eval s p return True for all assignments s ?

Lets make things concrete!

We will look very closely at the following

- 1. Propositional Logic
- 2. Propositional Logic + Theories
  - Equality
  - Uninterpreted Functions
  - Difference-Bounded Arithmetic

(Why? Representative & have "efficient" decision procedures)

### Propositional Logic + Theory of Equality

- 1. Values =  $\dots$  + Integer
- Operator none
- 3. Relation
  - Syntax : a Eq b or a Ne b
  - Semantics

eval Eq [n, m] = (n == m) eval Ne [n, m] = not (n == m)

### Example

(x1 'And' x2 'And' x3) 'And' (x1 <=> a 'Eq' b) 'And' (x2 <=> b 'Eq' c) 'And' (x3 <=> a 'Ne' c)

Propositional Logic + Theory of Equality

### Example

(x1 'And' x2 'And' x3) 'And' (x1 <=> a 'Eq' b) 'And' (x2 <=> b 'Eq' c) 'And' (x3 <=> a 'Ne' c)

### **Decision Procedures?**

Sat Does eval s p return True for some assignment s ?

Can we enumerate over all assignments? [No]

We will look very closely at the following

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- 2. Propositional Logic + Theories
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(Why? Representative & have "efficient" decision procedures)

Propositional Logic + Theory of Equality + Uninterpreted Functions

- 1. Values : ... + functions [Value] -> Value
- 2. Operator : App (apply App [f,a,b] or just f(a,b))
- 3. Relation : Eq and Ne (from before)
- Extended eval

```
eval s (App (e : [e1...en])) = (eval s e) (eval s e1 ... ev
Example
```

```
(x1 'And' x2 'And' x3 )
'And' (x1 <=> a 'Eq' g(g(g(a))) )
'And' (x2 <=> a 'Eq' g(g(g(g(g(a))))))
'And' (x3 <=> a 'Ne' g(a) )
```

### Decision Procedures ?

Sat Does eval s p return True for some assignment s ? \_ \_\_\_\_

We will look very closely at the following

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(Why? Representative & have "efficient" decision procedures)

### Propositional Logic + Difference Bounded Arithmetic

- 1. Values : ... + Integer
- 2. Operator : None
- 3. Relation : DBn(x,y) (or, x y  $\leq n$ )
- Extended eval

eval s (DB (e1, e2, n)) = (eval s e1) - (eval s e2) <= n

#### Example

(x1 'And' x2 'And' x3) 'And' (x1 <=> a - b <= 5 ) 'And' (x2 <=> b - c <= 10 ) 'And' (x3 <=> c - a <= -20 )</pre>

#### **Decision Procedures ?**

Sat Does eval s p return True for some assignment s ?

- ► Can we *enumerate* over all assignments? [Hell, no!]
- ....

### Next Time: Decision Procedures for SAT/SMT

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