

Wrapping up the first half:

First-order logic for security analysis,  
First-order logic in Coq,  
Constructive logic,  
& Inductive proofs on paper/Coq

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# Network Security Analysis via Predicate Logic

# Process for applying theory to practice

1. Learn about problem
2. Create a formal model of the problem
3. State the goal
4. Use some kind of tool (theorem prover, SAT solver, etc.) to solve

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# Problem

- We have a network of many computers (100s-1,000s-10,000s)
- Each computer only allows certain kinds of connections (example: the accounting computer only allows the CEO's computer to access it; anyone in the world can access the http services of the web server)
- Each computer is running different kinds of software
  - Mail software
  - Sales software
  - Office software
  - Web hosting software
  - etc.
- Often different computers are running different versions, different patches, etc.

# Problem

We wish to guarantee some security policy, such as:

- Only the CEO can access at the accounting data

How can we try to do this?

Fact: most security breaches are exploits of known vulnerabilities. Defending against truly new vulnerabilities is really hard, so let's concentrate on the common case.

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# Why do you take CS courses?

In this class, we are teaching you a set of tools

- Propositional Logic
- SAT Solving
- Natural Deduction
- Theorem Proving
- Predicate Logic
- Modal Logic
- Temporal Logic
- Model Checkers
- Hoare Logic



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Learning the tools is not easy...

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... but figuring out which tools can help in which situations is hard (knowing the tools well is a prerequisite, which is why you take courses...)

Usually you have to study a problem for some time before you get a good idea.

# Model

- We will model the network with a series of implications (essentially how an attacker would break our policy)
- We have two basic classes of rules:
  - Network topology
  - Attack vulnerability
- Example rules (network topology):
  - forall (p : computer), AccessHTTP(p, WebServerComputer)
  - ...
  - RunningApache1.0(WebServerComputer)
  - ...

# More rules

- Attack vulnerability rule:
  - ...
  - KnownAttack42: forall (p1 : computer) (p2 : computer),  
RunningApache1.0(p2) -> AccessHTTP(p1,p2) ->  
TakeOver(p1,p2)
  - ...

Uh oh...

It appears that anyone can take over the webserver!

# More rules

- ...
- TakeOver(CEOComputer, AccountingComputer)
- ...

The CEO likes direct access to the accounting computer so that he can see the latest sales results.

# More rules

- ...
- `AccessReportTool(WebServerComputer, CEOComputer)`
- ...

The CEO likes to get regular reports and statistics from his webserver, so he uses `AccessReportTool`, which is this really great piece of software, to do this.

# More rules

- ...
- KnownAttack212: forall p1 p2,  
    AccessReportTool(p1,p2) -> TakeOver(p1,p2)
- ...

Unfortunately, he downloaded it from a hacker website...



# How to hack the accounting computer (and why an evildoer would want to)

1. Access the webserver:
  - forall (p : computer), AccessHTTP(p, WebServerComputer)
2. Since the webserver is running an old version of Apache, take it over:
  - RunningApache1.0(WebServerComputer)
  - KnownAttack42: forall (p1 : computer) (p2 : computer),  
RunningApache1.0(p2) -> AccessHTTP(p1,p2) -> TakeOver(p1,p2)
3. Since the CEO is nice enough to have installed AccessReportTool and let it access his machine, use it to take it over:
  - AccessReportTool(WebServerComputer, CEOComputer)
  - KnownAttack212: forall p1 p2,  
AccessReportTool(p1,p2) -> TakeOver(p1,p2)
4. Since the CEO likes direct access to the accounting computer, you can now take over the accounting computer
  - TakeOver(CEOComputer, AccountingComputer)
5. Transfer money to secret bank account
6. Flee country

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# Goal

What you want to show is that:

forall p, p <> CEOComputer ->

~TakeOver(p, AccountingComputer)

This is one way to formally state the policy; as the policy gets more complicated it gets harder to state it...

# Process for applying theory to practice

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# 5. Building a business...

- Network Topology
  - Which connections different computers accept
  - This must be determined by some kind of network analysis tool, maybe that you run each night
- Known Attacks
  - Distributed by some security firm (think antivirus software)

(unfortunately, other people have already patented this idea...)

- First-order logic in Coq
- Constructive logic
- An example inductive proof

# First-order logic in Coq

- (See script)

- ~~First-order logic in Coq~~
- Constructive logic
- An example inductive proof



# Constructive Logic

- Definition & History
- Impact on Computing
- Mixing Constructive and Classical Logic

# Definition

- Constructive logic (a.k.a. Intuitionistic Logic) is obtained from standard logic by removing certain rules such as:
  - Law of Excluded Middle
  - Double Negation Elimination
  - Axiom of Choice

# Definition

- The focus is on producing witnesses and/or justification as opposed to only establishing truth
- From these points, you can see that Constructive logic is *weaker* than Classical logic in the sense of what you can prove
- But *stronger* in what a proof means/gives you

# History

- At the beginning of the 1900s there was a major effort (e.g., Frege, Hilbert) to put all of mathematics on a common base of axioms
- Unfortunately, these failed; first in a not-obviously-fatal way (e.g., Russell); and then later in a more profound way (Gödel)

# History

- The result was a considerable debate: how could mathematics be done in a sound way?
- Consider two statements:
  - There is a prime number larger than 100
  - 101 is a prime number larger than 100
- The first one says something exists – but does not help you find a witness
- The second one not only tells you that something exists but \*what that object is\*.

# An example proof

- Goal: show that there exists two irrational numbers,  $a$  &  $b$ , such that  $a^b$  is rational.
- Proof: let  $x$  be the square root of 2 (that is,  $2^{(1/2)}$ ). We know that  $x$  is irrational. Now consider the number  $y = x^x$ . By law of excluded middle, we know that either
  - $y$  is rational: in this case  $a = b = x$
  - $y$  is irrational: in this case observe that  $y^x = 2$ . Thus  $a = y$  and  $b = x$ .

# So that's pretty cool...

- But what are  $a$  and  $b$ ?
- Well, *probably*  $x^x$  is irrational, so *probably*  $a = x^x$  and  $b = x$ .
- But can you prove it? Proving concrete numbers are irrational is usually pretty hard.
- You'd have to prove it without LEM, too...

# What a constructive proof would mean

- If we had a *constructive* proof then we would be able to examine the proof and calculate exactly what  $a$  and  $b$  are.
- One of the philosophical positions that was advocated (e.g., by Brouwer) during the debate was that all of mathematics should be constructive: if you prove something exists you need to be able to find a witness.



# History

- Arend Heyting (and others) discovered that the inability to find a witness was related to the use of a small number of proof rules:
  - Law of Excluded Middle (as you just saw!)
  - ...
- Constructivists believed that all of mathematics should be rebuilt without using these rules

# History

- Constructivists lost the debate, and for many years modern mathematics has freely continued to use LEM; constructive logic largely was ignored for the last 100 years.
- However, the rise of computing as a field has changed that.

# Constructive Logic and Computing

- Computing is deeply concerned with finding witnesses to problems (e.g., it is not enough to know that a list can be sorted: we want to produce the sorted list in question!)
- Constructive proofs, remember, can be “mined” to produce witnesses.

# Constructive Logic and Computing

- Thus, if someone gives you a constructive proof of the existence of some object, an *algorithm* exists that can find that object.
- Even better, the steps of the algorithm can be determined by examining the proof!
- This means that often constructive logic is very helpful for reasoning about computation.

# Mixing Constructive and Classical Logic

- So if constructive logic has a use in reasoning about computation, then why don't we just teach you pure constructive logic and forget about LEM?
  - Often we don't care about computation even though we are in computing: we just care about whether something is true. For example, if we can prove that a computer system is secure using LEM, that is enough!
  - In the cases when we don't care, constructive proofs are often much harder to develop (is “ $y$ ” irrational?)
  - The semantics of constructive logic are considerably more complicated (e.g., no truth tables!).

# Mixing Constructive and Classical Logic

- However, since it is sometimes useful we want you to be aware of it
- We also want you to be aware that when there is an application of constructive logic, it is useful to *\*also\** use classical logic in the parts of the proof where witnesses are not needed.

# Mixing Constructive and Classical Logic

- In this case, one needs to add extra logical connectives when they differ between constructive proofs and classical proofs.
  - Use  $\vee$  for classical disjunction, and  $+$  for constructive
    - $P \vee Q$  means, either P or Q is true
    - $P + Q$  means, either P or Q is true and here is an algorithm for deciding
  - Use “exists” for classical existence, and “existsC” for constructive
    - exists x, P means there is an x that makes P true
    - existsC x, P means there is an x that makes P true, and if you want I can tell you exactly which x it is
  - etc.

# Mixing Constructive and Classical Logic

- Some operators you don't need to do this:
  - $P \wedge Q$  has the same meaning in both constructive and classical logic
  - So does “forall”, “ $\rightarrow$ ”, etc.
- Also, obviously, all of the constructive operators imply the classical ones:
  - $P + Q \rightarrow P \vee Q$
  - $\text{existsC } x, P \rightarrow \text{exists } x, P$



# Mixing Constructive and Classical Logic

- Of course, the other way around does not hold:  $P \vee Q$  (“ $y$  irrational”  $\vee$  “ $y$  rational”) does not imply  $P + Q$ .
- By using these special connectives then it is possible to mix constructive and classical logic and be sure that the things one needs to be computable remain that way.
- Coq has this kind of functionality built-in, but it is beyond the scope of this module to use it.

- ~~First-order logic in Coq~~
- ~~Constructive logic~~
- An example inductive proof

# Inductive definitions

- Consider the following definitions:
  - $\text{Nat} = Z \mid S(\text{Nat})$
  - $\text{Add}(a,b) =$ 
    - $b$  when  $a = Z$
    - $S(\text{Add}(a',b))$  when  $a = S(a')$
- For example,  $\text{Add}(S(S(Z)), S(Z)) =$   
 $S(\text{Add}(S(Z), S(Z))) = S(S(\text{Add}(Z, S(Z)))) = S(S(S(Z)))$

# Goal

- We would like to show that
  - for all  $a, b$ ,  $\text{Add}(a,b) = \text{Add}(b,a)$
- How can we do this?
- Structural induction.

# Lemma 1

- Rather than attack from problem as a whole, we will break it into pieces (called lemmas):
  - Lemma 1: forall a b, Add (a, S(b)) = S(Add(a,b))
- Proof: we will do **structural induction** on the structure of “a”, using induction hypothesis  
$$P = \text{“Add (a,S(b)) = S(Add (a,b))”}.$$
- **Very Important**
  - Say what you are doing induction on (structure of a)
  - Give your induction hypothesis **explicitly** at the beginning of the proof (P)
  - In your induction hypothesis, occurrences of the object over which you are doing induction (a) are **free variables**.
  - We are **not** using the induction hypothesis “forall a b, Add (a, S(b)) = S(Add (a, b))” – **this is what we are trying to prove**.

# Break into cases

- We now get two cases. Recall that  $\text{Nat} = Z \mid S(\text{Nat})$ :
  - Case 1:  $a = Z$ . Then we need to prove  $P$  with  $a = Z$ :
    - $\text{Add}(Z, S(b)) = S(\text{Add}(Z, b))$
  - Case 2:  $a = S(a')$ . Then we **may assume**  $P$  on  $a'$ :
    - $\text{Add}(a', S(b)) = S(\text{Add}(a', b))$
  - and **must prove**  $P$  on  $a$  :
    - $\text{Add}(a, S(b)) = S(\text{Add}(a, b))$
- One we prove both cases, we have used structural induction to prove “forall  $a$ ,  $P$ ” – that is,
  - forall  $a$   $b$ ,  $\text{Add}(a, S(b)) = S(\text{Add}(a, b))$
  - Note: now  $a$  is **not free** in this formula since it is bound by the forall.

# Lemma 1, Case 1

- Case 1:  $a = Z$ .
  - We want to prove  $[a = Z] P$
  - That is,  $\text{Add}(Z, S(b)) = S(\text{Add}(Z, b))$ 
    1.  $\text{Add}(Z, S(b)) = S(b)$  By def. of Add
    2.  $b = \text{Add}(Z, b)$  By def. of Add
    3.  $\text{Add}(Z, S(b)) = S(\text{Add}(Z, b))$  Substitute (2) into (1)
  - So we are done with case 1.
- **Very Important**
  - Say which case you are in “ $a = Z$ ”
  - Say what you want to prove “ $\text{Add}(Z, S(b)) = S(\text{Add}(Z, b))$ ”

# Lemma 1, Case 2

- Case 2:  $a = S(a')$ .
  - We may assume  $[a \Rightarrow a'] P$
  - That is,  $\text{Add}(a', S(b)) = S(\text{Add}(a', b))$
  - We want to prove  $[a \Rightarrow S(a')] P$
  - That is,  $\text{Add}(S(a'), S(b)) = S(\text{Add}(S(a'), b))$ 
    1.  $\text{Add}(S(a'), S(b)) = S(\mathbf{Add}(a', \mathbf{S}(b)))$  By def. of Add
    2.  $\text{Add}(S(a'), S(b)) = S(\mathbf{S}(\mathbf{Add}(a', \mathbf{b})))$  Substitute IH into (2)
    3.  $\text{Add}(S(a'), S(b)) = S(\text{Add}(S(a'), b))$  By def. of Add
  - So we are done with case 2.
- **Very Important**
  - Say precisely what the induction hypothesis is.



# Lemma 1, conclusion

- Are we done?
- NO. We must finish the proof by saying something like,
- “Structural induction lets us conclude,  
– for all  $a, b$ ,  $\text{Add}(a, S(b)) = S(\text{Add}(a, b))$ ”

# Lemma 2

- We continue with another lemma (subproof):
  - Lemma 2: for all  $a$ ,  $\text{Add}(a, Z) = \text{Add}(Z, a)$
- Proof: we will do **structural induction** on the structure of “ $a$ ”, using induction hypothesis  $P = \text{“Add}(a, Z) = \text{Add}(Z, a)\text{”}$ .
  - **Very Important**
    - Say what you are doing induction on (structure of  $a$ )
    - Give you induction hypothesis **explicitly** at the beginning of the proof ( $P$ )
    - In your induction hypothesis, occurrences of the object over which you are doing induction are **free variables**.

# Break into cases

- We now get two cases. Recall that  $\text{Nat} = Z \mid S(\text{Nat})$ :
  - Case 1:  $a = Z$ . Then we need to prove  $P$  with  $a = Z$ : “ $\text{Add}(Z,Z) = \text{Add}(Z,Z)$ ”.
  - Case 2:  $a = S(a')$ . Then we **may assume**  $P$  on  $a'$ : “ $\text{Add}(a', Z) = \text{Add}(Z, a')$ ”, and **must prove**  $P$  on  $a$ : “ $\text{Add}(a,Z) = \text{Add}(Z,a)$ ”
- One we prove both cases, we have used structural induction to prove “for all  $a$ ,  $P$ ” – that is, “for all  $a$ ,  $\text{Add}(a,Z) = \text{Add}(Z,a)$ ”
- Note: now  $a$  is **not free** in this formula since it is bound by the for all.

# Lemma 2, Case 1

- Case 1:  $a = Z$ .
  - We want to prove  $[a = Z] P$
  - That is,  $\text{Add}(Z,Z) = \text{Add}(Z,Z)$
  - This is directly from reflexivity of equality
  - So we are done
- **Very Important**
  - Say which case you are in ( $a = Z$ )
  - Say what you want to prove ( $\text{Add}(Z,Z) = \text{Add}(Z,Z)$ )

## Lemma 2, Case 2

- Case 2:  $a = S(a')$ 
  - We may assume  $[a \Rightarrow a'] P$
  - That is,  $\text{Add}(a', Z) = \text{Add}(Z, a')$
  - We want to prove  $[a \Rightarrow S(a')] P$
  - That is,  $\text{Add}(S(a'), Z) = \text{Add}(Z, S(a'))$

## Lemma 2, Case 2

- $\text{Add}(S(a'), Z) = S(\text{Add}(a', Z))$       by def. of Add
- $S(\text{Add}(a', Z)) = S(\text{Add}(Z, a'))$       by  $[a \Rightarrow a']$   
P (IH)
- $S(\text{Add}(Z, a')) = \text{Add}(Z, S(a'))$       by Lemma 1
- And we are done with case 2; now we can conclude:
  - Thus by structural induction we prove “for all  $a$ ,  $\text{Add}(a, Z) = \text{Add}(Z, a)$ ”.

# Theorem, Proof

- Goal: for all  $a, b$ ,  $\text{Add}(a,b) = \text{Add}(b,a)$
- Proof: we will use structural induction on “ $a$ ” using the induction hypothesis  $P$ :
  - for all  $b$ ,  $\text{Add}(a, b) = \text{Add}(b,a)$
- Important: note that this is a **stronger** hypothesis than the weaker  $P'$ :
  - $\text{Add}(a,b) = \text{Add}(b,a)$
- In the second hypothesis, “ $b$ ” is a **constant** (like 7); in the first “ $b$ ” is a bound universal variable
  - $P \rightarrow P'$ , but  $P'$  does not imply  $P$ .

# Theorem, Case 1

- Case 1:  $a = Z$ ; we must prove
  - for all  $b$ ,  $\text{Add}(Z, b) = \text{Add}(b, Z)$
- But this is just Lemma 2, so we are done.



# Theorem, Case 2

- Case 2:  $a = S(a')$  and we can assume the induction hypothesis
  - for all  $b$ ,  $\text{Add}(a', b) = \text{Add}(b, a')$
- We want to prove
  - for all  $b$ ,  $\text{Add}(S(a'), b) = \text{Add}(b, S(a'))$
  - $\text{Add}(S(a'), b) = S(\text{Add}(a', b))$       Definition of Add
  - $S(\text{Add}(a', b)) = S(\text{Add}(b, a'))$       IH
  - $S(\text{Add}(b, a')) = \text{Add}(b, S(a'))$       Lemma 1

# Conclusion

- Structural Induction thus lets us conclude that
  - for all  $a$   $b$ ,  $\text{Add}(a, b) = \text{Add}(b, a)$
- Now let's do the same proof in Coq.
  - (See script)