# Proof Assistant as Teaching Assistant

#### A View from the Trenches

ITP 2010

#### Benjamin C. Pierce University of Pennsylvania



#### An Experiment



# in Pedagogy

## Goal

#### Goal

From...

#### Teaching theorem proving as a topic in its own right

#### Goal

From...

#### Teaching theorem proving as a topic in its own right

То...

Theorem prover as a framework for teaching something else

#### A "software foundations" course for students from a broad range of backgrounds

#### Parameters

- Taught yearly at Penn
- 30-70 students
- Semi-required course for masters and PhD students
- Mix of undergraduates, MSE students, and PhD students (mostly not studying PL)
- I3 weeks, 23 lectures (80 minutes each), plus 3 review sessions and 3 exams
- Weekly homework assignments (~10 hours each)

#### A "Software Foundations" Syllabus

(for the masses)

#### Logic

- Inductively defined relations
- Inductive proof techniques

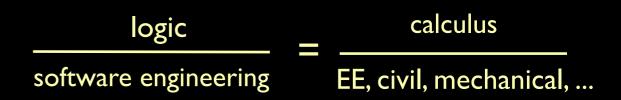
#### **Functional Programming**

 programs as data, polymorphism, recursion, ...

#### **PL** Theory

- Precise description of program structure and behavior
  - operational semantics
  - lambda-calculus
- Program correctness
  Hoare Logic





- FPLs are going mainstream (Haskell, Scala, F#, ...)
- Individual FP ideas are already mainstream
  - mutable state = bad (e.g. for concurrency)
  - polymorphism = good (for reusability)
  - higher-order functions = useful
  - ...
- Language design is a pervasive activity

- Program meaning and correctness are pervasive concerns
- Types are a pervasive technology

## Oops, forgot one thing...

- The difficulty with teaching many of these topics is that they presuppose the ability to read and write mathematical proofs
- In a course for arbitrary computer science students, this turns out to be a <u>really bad</u> <u>assumption</u>

#### My List (II)

#### Proof!

 The ability to recognize and construct rigorous mathematical arguments Sine qua non...

#### My List (II)

#### Proof!

The ability to recognize and construct rigorous mathematical arguments

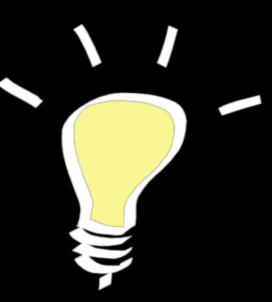
Sine qua non...

#### But...

Very hard to teach these skills effectively in a large class (while teaching anything else)

Requires an instructor-intensive feedback loop

## A Bright Idea...



#### automated proof assistant = one TA per student

### ...With Major Consequences!

 Using a proof assistant completely shapes the way ideas are presented

• Working "against the grain" is a really bad idea

• Learning to drive a proof assistant is a significant intellectual challenge

### ...With Major Consequences!

 Using a proof assistant completely shapes the way ideas are presented

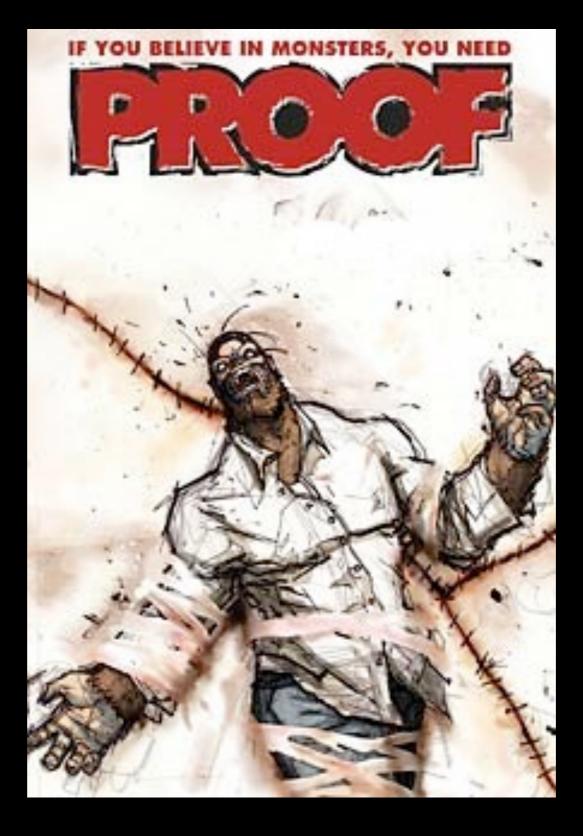
• Working "against the grain" is a really bad idea

- Learning to drive a proof assistant is a significant intellectual challenge
  - ⇒ Restructure entire course around the idea of proof

### Any Questions?

Let's talk...

## What is



2

explanation vs. proof

#### formal vs. informal

plausible vs. deductive

#### inductive vs. deductive

#### detailed vs. formal

#### intuition vs. knowledge

careful vs. rigorous

Proofs optimized for conveying <u>understanding</u>

VS.

Proofs optimized for conveying <u>certainty</u>

Very hard to teach!  $\setminus$ 

Proofs optimized for conveying <u>understanding</u>

VS.

Proofs optimized for conveying <u>certainty</u>

Very hard to teach! But addressed in lots of other courses

Proofs optimized for conveying <u>understanding</u>

VS.

Proofs optimized for conveying <u>certainty</u>

Very hard to teach! But addressed in lots of other courses Proofs optimized for conveying <u>understanding</u>

VS.

Proofs optimized for conveying <u>certainty</u>

Critically needed for doing PL

Very hard to teach! But addressed in lots of other courses

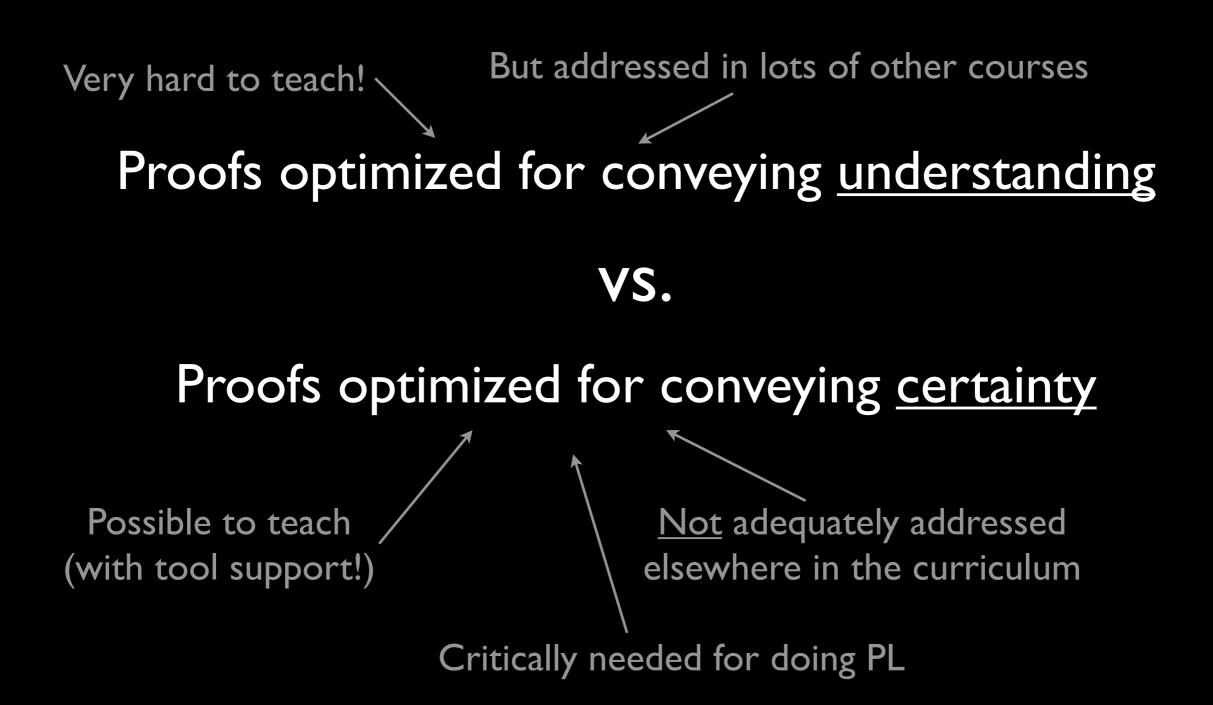
Proofs optimized for conveying <u>understanding</u>

VS.

Proofs optimized for conveying <u>certainty</u>

Not adequately addressed elsewhere in the curriculum

Critically needed for doing PL

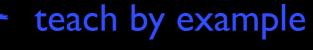


#### A Spectrum of "Certainty Proofs"

Detailed proof in natural language
 Proof-assistant script instructions for writing...
 Formal proof object program for constructing...

"Certainty" is far from being a sign of success, it is only a symptom of lack of imagination, of conceptual poverty. It produces smug satisfaction and prevents the growth of knowledge. — Lakatos

#### A Spectrum of "Certainty Proofs"



- I. Detailed proof in natural language
- 2. Proof-assistant script
- 3. Formal proof object

mostly ignore

#### concentrate here

"Certainty" is far from being a sign of success, it is only a symptom of lack of imagination, of conceptual poverty. It produces smug satisfaction and prevents the growth of knowledge. — Lakatos

#### Goals

(ideally)

We would like students to be able to

- I. write correct definitions
- 2. make useful / interesting claims about them
- 3. verify their correctness (and find bugs)
- 4. write clear proofs demonstrating their correctness

#### The Course



# Choosing One's Poison

Many proof assistants have been used to teach programming languages...

(usually to a narrower audience)

Isabelle HOL Coq

Tutch

SASyLF

Agda

ACL2

etc.

<u>None</u> is perfect

I chose Coq

• Curry-Howard gives a nice story, from FP through "programming with propositions"

- Curry-Howard gives a nice story, from FP through "programming with propositions"
- Mature tool

- Curry-Howard gives a nice story, from FP through "programming with propositions"
- Mature tool
- Automation

- Curry-Howard gives a nice story, from FP through "programming with propositions"
- Mature tool
- Automation
- Familiarity

- Curry-Howard gives a nice story, from FP through "programming with propositions"
- Mature tool
- Automation
- Familiarity
- Local expertise

# Choosing My Poison

I chose Coq

- Curry-Howard gives a nice story, from FP through "programming with propositions"
- Mature tool
- Automation
- Familiarity
- Local expertise



# Choosing My Poison

I chose Coq

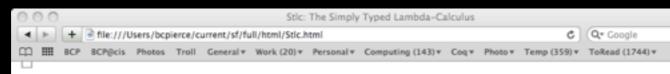
- Curry-Howard gives a nice story, from FP through "programming with propositions"
- Mature tool
- Automation
- Familiarity
- Local expertise



And now that we've got the hard part out of the way...

```
000
                                    local
(** ** Type soundness *)
Definition stepmany := (refl_step_closure step).
Notation "t1 '\rightarrow *' t2" := (stepmany t1 t2) (at level 40).
Corollary soundness : forall t t' T,
  has type t T ->
  t ~~>* t' ->
  ~(stuck t').
Proof.
  intros t t' T HT P. induction P; intros [R S].
  destruct (progress x T HT); auto.
  apply IHP. apply (preservation x y T HT H).
  unfold stuck. split; auto. Qed.
(** ** Additional exercises *)
--:-- Stlc.v
                   35% L497 (coq Holes Scripting) ---- 10:40am -----
1 subgoal
  t : tm
  t':tm
  T : ty
  HT : has type t T
  P:t ~~>* t'
   ~ stuck t'
     *goals*
                  All L1
                             (CogGoals Holes) ---- 10:40am ---
```

```
0.00
(** ** Type soundness *)
(** Putting progress and preservation together, we can see
   that a well-typed term can _never_ reach a stuck state. *)
Definition stepmany := (refl_step_closure step).
Notation "t1 '~~>*' t2" := (stepmany t1 t2) (at level 40).
Corollary soundness : forall t t' T,
  has type t T ->
  t ~~>* t' ->
  ~(stuck t').
Proof.
  intros t t' T HT P. induction P; intros [R S].
  destruct (progress x T HT); auto.
  apply IHP. apply (preservation x y T HT H).
  unfold stuck. split; auto. Qed.
(** Indeed, in the present -- extremely simple -- language,
   every well-typed term can be reduced to a value: this is the
   normalization property. In richer languages, this property
   often fails, though there are some interesting
    languages (such as Cog's [Fixpoint] language, and the simply
   typed lambda-calculus, which we'll be looking at next) where
    all well-typed terms can be reduced to normal forms. *)
```



#### Type soundness

Putting progress and preservation together, we can see that a well-typed term can never reach a stuck state.

```
Definition stepmany := (refl_step_closure step).
```

```
Notation "t1 '~~>*' t2" := (stepmany t1 t2) (at level 40).
```

```
Corollary soundness : forall t t' T,
has_type t T ->
t ~~>* t' ->
~(stuck t').
Proof.
intros t t' T HT P. induction P; intros [R S].
destruct (progress x T HT); auto.
apply IHP. apply (preservation x y T HT H).
unfold stuck. split; auto. Qed.
```

Indeed, in the present -- extremely simple -- language, every well-typed term can be reduced to a value: this is the normalization property. In richer languages, this property often fails, though there are some interesting languages (such as Coq's Fixpoint language, and the simply typed lambda-calculus, which we'll be looking at next) where all *well-typed* terms can be reduced to normal forms.

#### Additional exercises

#### Exercise: 2 stars (subject\_expansion)

Having seen the subject reduction property, it is reasonable to wonder whether the opposity property -- subject EXPANSION -- also holds. That is, is it always the case that, if t ~~> t' and has\_type t' T, then has\_type t T? If so, prove it. If not, give a counter-example.

(\* FILL IN HERE \*)

\*... in a web browser, with an index and hyperlinks to definitions And check out: Narrating Formal Proof, Carst Tankink, Herman Geuvers and James McKinna, at UITP on Thursday...

# Guided Tour

# Course Overview

- Basic functional programming (and fundamental Coq tactics)
- Logic (and more Coq tactics)
- While programs and Hoare Logic
- Simply typed lambda-calculus
- References and store typing
- Subtyping

## Cold Start

Start from bare, unadorned Coq

- No libraries
- Just inductive definitions, structural recursion, and (dependent, polymorphic) functions

### Basics

Inductively define booleans, numbers, etc. Recursively define functions over them.

```
Inductive nat : Type :=
    | 0 : nat
    | S : nat -> nat.

Fixpoint plus (n : nat) (m : nat) {struct n} : nat :=
    match n with
    | 0 => m
    | S n' => S (plus n' m)
    end.
```

Restriction to structural recursion is not a big deal, provided we choose examples a bit carefully

# Proof by Simplification

A few simple theorems can be proved just by betareduction...

Theorem plus\_0\_1 : forall n:nat, plus 0 n = n.

Proof. reflexivity. Qed.

# Proof by Rewriting

A few more can be proved just by substitution using equality hypotheses.

```
Theorem plus_id_example : forall n m:nat,
  n = m -> plus n n = plus m m.
```

Proof.

```
intros n m. (* move both quantifiers into the context *)
intros H. (* move the hypothesis into the context *)
rewrite -> H. (* Rewrite the goal using the hypothesis *)
reflexivity. Qed.
```

# Proof by Case Analysis

More interesting properties require case analysis...

Theorem plus\_1\_neq\_0 : forall n,
 beq nat (plus n 1) 0 = false.

numeric comparison, returning a boolean

```
Proof.
```

```
intros n. destruct n as [| n'].
  reflexivity.
  reflexivity. Qed.
```

# Proof by Induction

... or, more generally, induction

```
Theorem plus_0_r : forall n:nat, plus n 0 = n.
Proof.
intros n. induction n as [| n'].
Case "n = 0". reflexivity.
Case "n = S n'". simpl. rewrite -> IHn'.
reflexivity.
Qed.
```

# Functional Programming

### Similarly, we can define (as usual)

- lists, trees, etc.
- polymorphic functions (length, reverse, etc.)
- higher-order functions (map, fold, etc.)

• etc.

### **Properties of Functional Programs**

The handful of tactics we have already seen are enough to prove a a surprising range of properties of functional programs over lists, trees, etc.

```
Theorem map_rev : forall (X Y : Type) (f : X -> Y) (l : list X),
map f (rev l) = rev (map f l).
```

# A Few More Tactics

To go further, we need a few additional tactics...

- inversion
  - e.g., from [x]=[y] derive x=y
- generalizing induction hypotheses
- unfolding definitions

### Programming with Propositions

"Coq has another universe, called **Prop**, where the types represent mathematical claims and their inhabitants represent evidence..."

### Programming with Propositions

```
Definition true_for_zero (P:nat->Prop) : Prop :=
    P 0.
```

```
Definition true_for_n_true_for_Sn (P:nat->Prop) (n:nat) :
Prop :=
P n -> P (S n).
```

```
Definition preserved_by_S (P:nat->Prop) : Prop :=
forall n', P n' -> P (S n').
```

```
Definition true_for_all_numbers (P:nat->Prop) : Prop :=
  forall n, P n.
```

```
Definition nat_induction (P:nat->Prop) : Prop :=
   (true_for_zero P)
```

- -> (preserved\_by\_S P)
- -> (true\_for\_all\_numbers P).

```
Theorem our_nat_induction_works : forall (P:nat->Prop),
    nat_induction P.
```



Familiar logical connectives can be built from Coq's primitive facilities...

```
Inductive and (A B : Prop) : Prop :=
  conj : A -> B -> (and A B).
```

Similarly: disjunction, negation, existential quantification, equality, ...

## Inductively Defined Relations

```
Inductive le (n:nat) : nat -> Prop :=
    | le_n : le n n
    | le S : forall m, (le n m) -> (le n (S m)).
```

```
Definition relation (X: Type) := X->X->Prop.
```

```
Definition reflexive (X: Type) (R: relation X) :=
  forall a : X, R a a.
```

```
Definition preorder (X:Type) (R: relation X) :=
  (reflexive R) /\ (transitive R).
```

## Expressions

```
Inductive aexp : Type :=
    ANum : nat -> aexp
    APlus : aexp -> aexp -> aexp
    AMinus : aexp -> aexp -> aexp
    AMult : aexp -> aexp -> aexp
    AMult : aexp -> aexp -> aexp.

Fixpoint aeval (e : aexp) {struct e} : nat :=
    match e with
    ANum n => n
    APlus al a2 => plus (aeval al) (aeval a2)
    AMinus al a2 => minus (aeval al) (aeval a2)
    AMult al a2 => mult (aeval al) (aeval a2)
    end.
```

#### (Similarly boolean expressions)

# Optimization

```
Theorem optimize_0plus_sound: forall e,
   aeval (optimize 0plus e) = aeval e.
```

#### Proof.

```
intros e. induction e.
Case "ANum". reflexivity.
Case "APlus". destruct e1.
  SCase "e1 = ANum n". destruct n.
    SSCase "n = 0". simpl. apply IHe2.
    SSCase "n <> 0". simpl. rewrite IHe2. reflexivity.
  SCase "e1 = APlus e1 1 e1 2".
    simpl. simpl in IHe1. rewrite IHe1. rewrite IHe2. reflexivity.
  SCase "e1 = AMinus e1 1 e1 2".
    simpl. simpl in IHe1. rewrite IHe1. rewrite IHe2. reflexivity.
  SCase "e1 = AMult e1 1 e1 2".
    simpl. simpl in IHe1. rewrite IHe1. rewrite IHe2. reflexivity.
Case "AMinus".
  simpl. rewrite IHe1. rewrite IHe2. reflexivity.
Case "AMult".
```

simpl. rewrite IHe1. rewrite IHe2. reflexivity. Qed.

## Automation

At this point, we begin introducing some simple automation facilities.

(As we go on further and proofs become longer, we gradually introduce more powerful forms of automation.)

```
Theorem optimize Oplus sound'': forall e,
  aeval (optimize Oplus e) = aeval e.
Proof.
  intros e.
  induction e;
    (* Most cases follow directly by the IH *)
   try (simpl; rewrite IHe1; rewrite IHe2; reflexivity);
   (* ... or are immediate by definition *)
    try (reflexivity).
  (* The interesting case is when e = APlus e1 e2. *)
  Case "APlus".
    destruct e1;
      try (simpl; simpl in IHel; rewrite IHel; rewrite IHe2; reflexivity).
    SCase "e1 = ANum n". destruct n.
      SSCase "n = 0". apply IHe2.
      SSCase "n <> 0". simpl. rewrite IHe2. reflexivity. Qed.
```

# While Programs

Inductive com : Type :=

CSkip : com CAss : id -> aexp -> com CSeq : com -> com -> com CIf : bexp -> com -> com -> com CWhile : bexp -> com -> com.

```
Notation "'SKIP'" :=
CSkip.
Notation "c1 ; c2" :=
(CSeq c1 c2) (at level 80, right associativity).
Notation "l '::=' a" :=
(CAss l a) (at level 60).
Notation "'WHILE' b 'DO' c 'LOOP'" :=
(CWhile b c) (at level 80, right associativity).
Notation "'IF' e1 'THEN' e2 'ELSE' e3" :=
(CIf e1 e2 e3) (at level 80, right associativity).
```

#### With a bit of notation hacking...

```
Definition factorial : com :=
   Z ::= !X;
   Y ::= A1;
   WHILE BNot (!Z === A0) DO
       Y ::= !Y *** !Z;
       Z ::= !Z --- A1
   LOOP.
```

# Program Equivalence

Definition cequiv (c1 c2 : com) : Prop :=
 forall (st st':state), (c1 / st ~~> st') <-> (c2 / st ~~> st').

#### Definitions and basic properties

• "program equivalence is a congruence"

Case study: constant folding

# Hoare Logic

Assertions

Hoare triples

Weakest preconditions

Proof rules

- Proof rule for assignment
- Rules of consequence
- Proof rule for SKIP
- Proof rule for ;
- Proof rule for conditionals
- Proof rule for loops

Using Hoare Logic to reason about programs

• e.g. correctness of factorial program

### Small-Step Operational Semantics

At this point we switch from big-step to smallstep style (and, for good measure, show their equivalence).

# Types

#### Fundamentals

• Typed arithmetic expressions

### Simply typed lambda-calculus

### Properties

- Free variables
- Substitution
- Preservation
- Progress
- Uniqueness of types

### Typechecking algorithm

 Dealing carefully with variable binding is hard; doing it <u>formally</u> is even harder

- Dealing carefully with variable binding is hard; doing it <u>formally</u> is even harder
- What to do?

- Dealing carefully with variable binding is hard; doing it <u>formally</u> is even harder
- What to do?
  - DeBruijn indices?

# The POPLMark Tarpit

- Dealing carefully with variable binding is hard; doing it <u>formally</u> is even harder
- What to do?
  - DeBruijn indices?
  - Locally Nameless?

# The POPLMark Tarpit

- Dealing carefully with variable binding is hard; doing it <u>formally</u> is even harder
- What to do?
  - DeBruijn indices?
  - Locally Nameless?
  - Switch to Isabelle? Twelf?

# The POPLMark Tarpit

- Dealing carefully with variable binding is hard; doing it <u>formally</u> is even harder
- What to do?
  - DeBruijn indices?
  - Locally Nameless?
  - Switch to Isabelle? Twelf?
  - Finesse the problem!

 Observation: If we only ever substitute closed terms, then capture-incurring and captureavoiding substitution behave the same.

- Observation: If we only ever substitute closed terms, then capture-incurring and captureavoiding substitution behave the same.
- Second observation [Tolmach]: Replacing the standard weakening+permutation with a "context invariance" lemma makes this presentation very clean.

- Observation: If we only ever substitute closed terms, then capture-incurring and captureavoiding substitution behave the same.
- Second observation [Tolmach]: Replacing the standard weakening+permutation with a "context invariance" lemma makes this presentation very clean.
- Downside: Doesn't work for System F

## Subtyping

#### • Records

- Subtyping relation
- Properties



#### The Fear

Old syllabus:

- inductive definitions
- operational semantics
- untyped  $\lambda$ -calculus
- simply typed λcalculus
- references
- exceptions
- records and subtyping
- Featherweight Java

New syllabus • Coq

## The Actuality

#### Old syllabus:

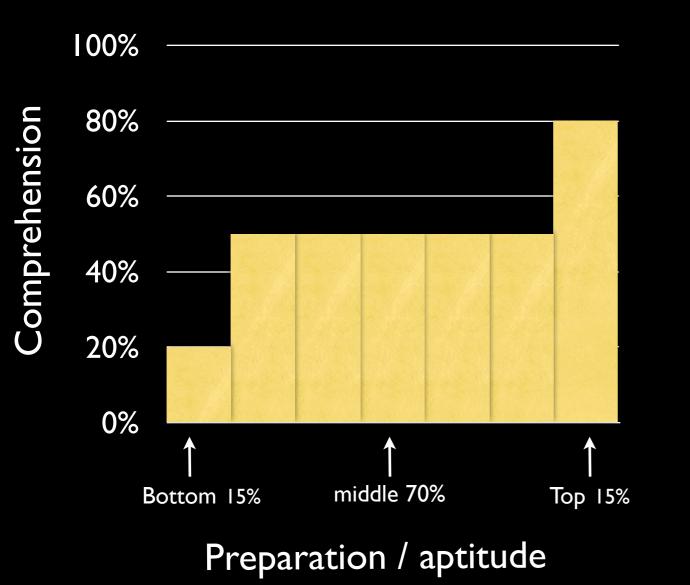
- inductive definitions
- operational semantics
- untyped  $\lambda$ -calculus
- simply typed λcalculus
- references
- exceptions
- records and subtyping
- Featherweight Java

- functional programming
- logic (and Curry-Howard)
- while programs
- program equivalence
- Hoare Logic
- Coq

New syllabus

## The Fear

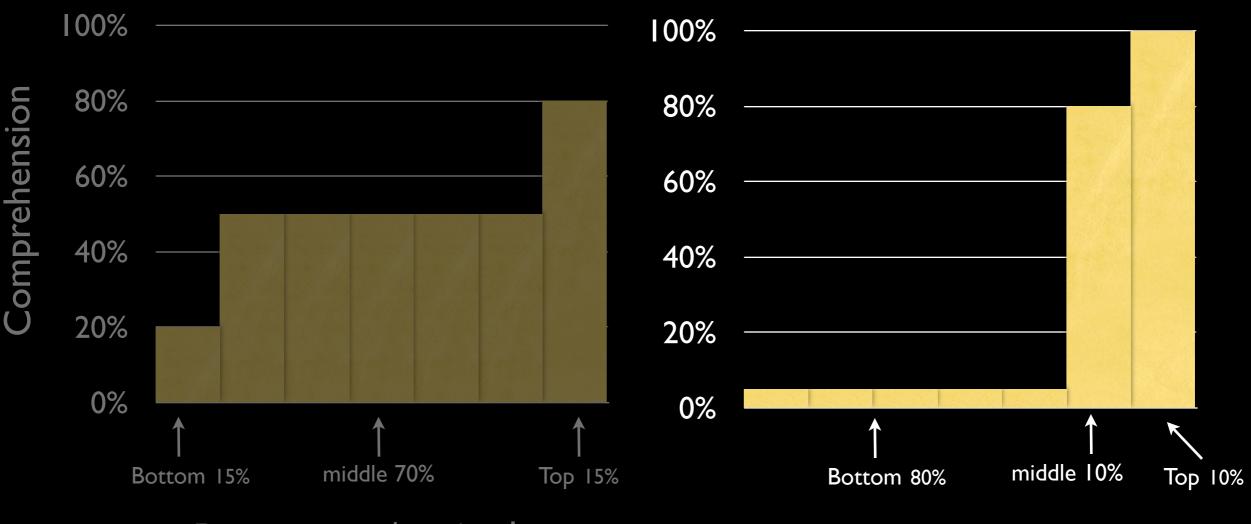
#### Before



## The Fear

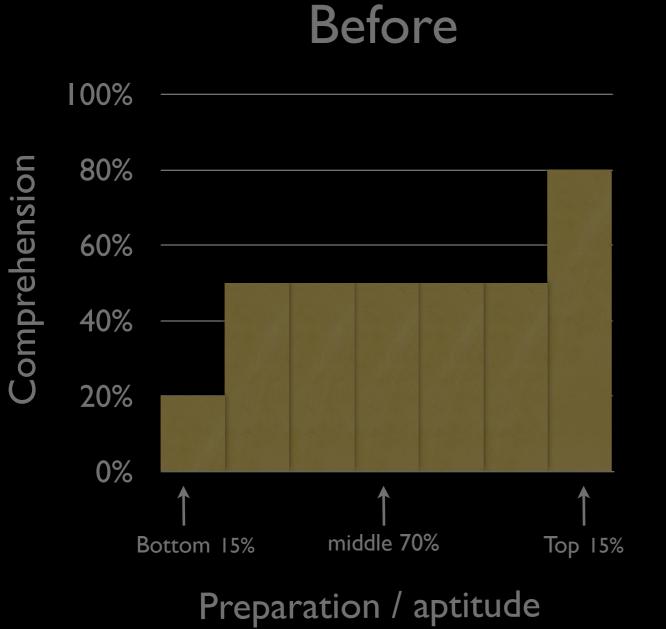
Before

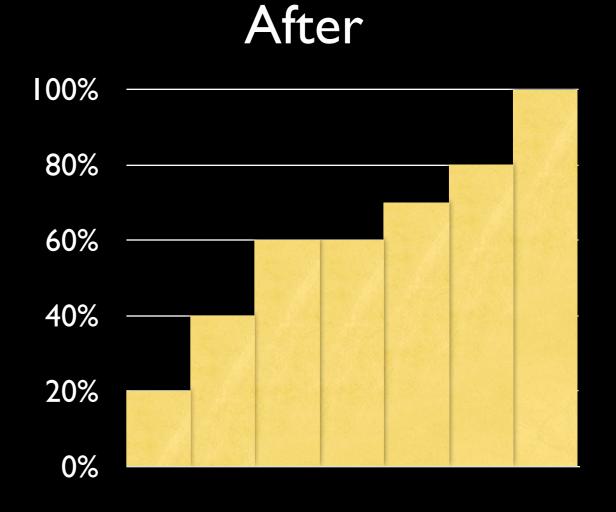




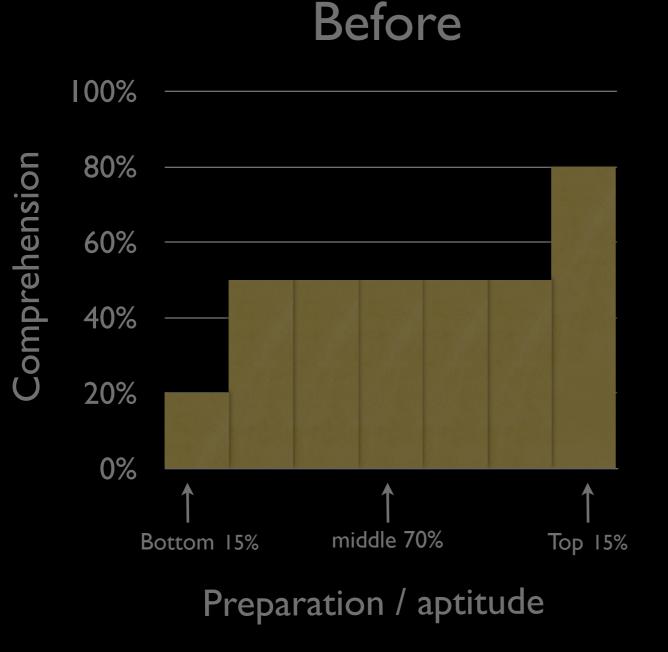
Preparation / aptitude

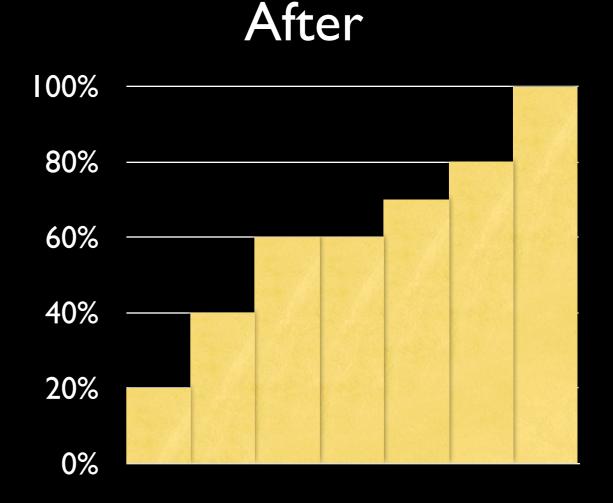
## The Actuality





## The Actuality





in fact, students typically performed better on <u>paper</u> exams than in pre-Coq offerings of the course

- I. write correct definitions
- 2. make useful / interesting claims about them
- 3. verify their correctness
  - I. by hand
  - 2. by writing proof scripts
- 4. write clear proofs of their correctness

pretty well

- I. write correct definitions
- 2. make useful / interesting claims about them
- 3. verify their correctness
  - I. by hand
  - 2. by writing proof scripts
- 4. write clear proofs of their correctness

pretty well

pretty well

- I. write correct definitions
- 2. make useful / interesting claims about them
- 3. verify their correctness
  - I. by hand
  - 2. by writing proof scripts
- 4. write clear proofs of their correctness

We would like students to be able to

- I. write correct definitions
- 2. make useful / interesting claims about them
- 3. verify their correctness
  - I. by hand

yes!

pretty well

pretty well

- 2. by writing proof scripts
- 4. write clear proofs of their correctness

pretty well

pretty well

- I. write correct definitions
- 2. make useful / interesting claims about them
- 3. verify their correctness a little
  - I. by hand yes!
  - 2. by writing proof scripts
- 4. write clear proofs of their correctness

pretty well

pretty well

yes!

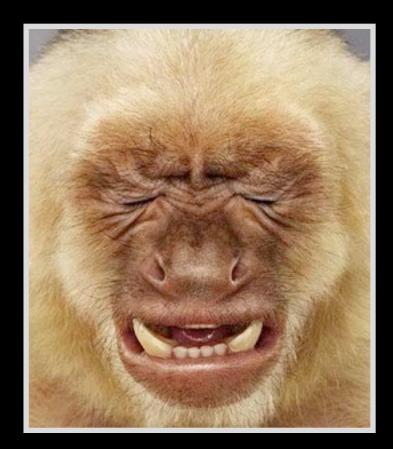
We would like students to be able to

- I. write correct definitions
- 2. make useful / interesting claims about them
- 3. verify their correctness a little
  - I. by hand <del><</del>
  - 2. by writing proof scripts
- 4. write clear proofs of their correctness

----- imperfectly

## One small catch...

Making up lectures and homeworks takes between one and two orders of magnitude more work for the instructor than a paper-and-pencil presentation of the same material!



# Is Coq The Ultimate TA?

Pros:

- Can really build everything we need from scratch
- Curry-Howard → nice unifying story
  - Proving = programming

# Is Coq The Ultimate TA?

#### Pros:

- Can really build everything we need from scratch
- Curry-Howard → nice unifying story
  - Proving = programming

Cons:

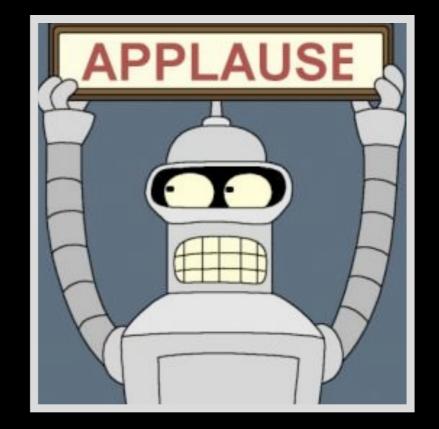
- Curry-Howard
  - Proving = programming → deep waters
  - Constructive logic can be confusing to students
- Annoyances
  - Lack of animation facilities
  - "User interface"
    - Notation facilities

My Coq proof scripts do not have the conciseness and elegance of Jérôme Vouillon's. Sorry, I've been using Coq for only 6 years...

## Bottom Line...

#### Bottom Line...

# t works!



## Want to



## Use Our Materials

- The course has been taught successfully at several places (Penn three times, Maryland, Portland State, Princeton, UCSD, Purdue, and the Oregon PL Summer School...)
- Full text of the notes (minus solutions) are publicly available as Coq scripts and HTML files:

http://www.cis.upenn.edu/~bcpierce/sf

# Improve Our Materials

#### Textbook model

- fixed (small) set of authors
- printed on paper
- limited scope
- new version every couple of years

#### OSS model

- electronic distribution
- many contributors (around a core group)
- extensible
- new versions as needed

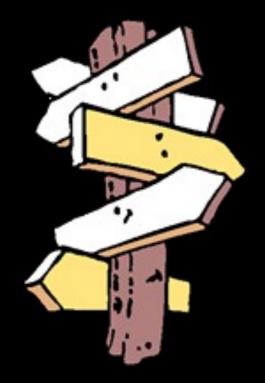
If you are teaching from these materials and want write access to the SVN repo, just email me

## Adapt Our Materials

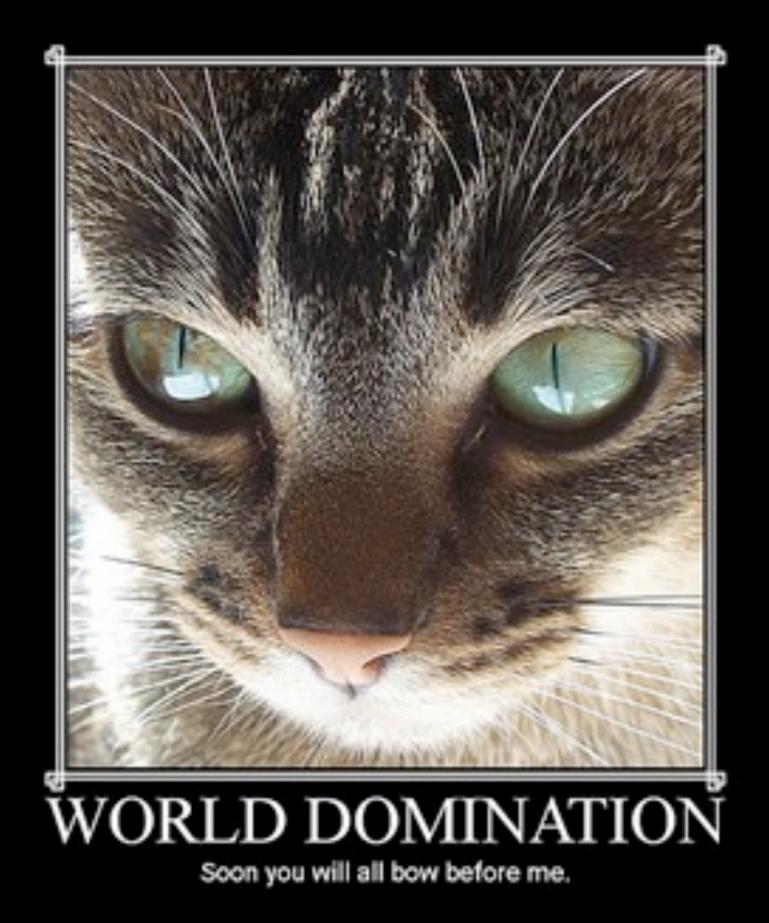
- Think this course would work better in Isabelle, Agda, ACL2, ...?
- Go for it!

#### Ignore Our Materials and do it your own way!

- The Software Foundations course is an existence proof
- Plenty of room for competing efforts



## What Next?



## Thin End of the Wedge: Compilers

- Verified compilers are becoming a hot topic
   Impressive recent achievements
  - Easy to see why it's important
- Beautiful expositions exist
  - e.g. Xavier Leroy's lecture notes from 2010 OPLSS
- Looks like a wonderful way to teach compilers

#### The Big Game: Undergrad Discrete Math

Similar issues:

- Students come into discrete math courses (at least in the U.S.) with little or no idea of "what is a proof"
- Insufficient instructor resources to give every student continuous feedback

#### The Big Game: Undergrad Discrete Math

Similar issues:

- Students come into discrete math courses (at least in the U.S.) with little or no idea of "what is a proof"
- Insufficient instructor resources to give every student continuous feedback

#### But not identical!

- Much less time must keep overhead lower
- Informal proof skills equally important
- Broader range of relevant math (number theory, graph theory, discrete probability...)



SF courseware co-authors:

Chris Casinghino, Michael Greenberg, Vilhelm Sjöberg, Brent Yorgey

More contributors:

Andrew W.Appel, Jeffrey Foster, Michael Hicks, Ranjit Jhala, Greg Morrisett, Leonid Spesivtsev, and Andrew Tolmach

http://www.cis.upenn.edu/~bcpierce/sf/