

Dependent Types

April 24th, 2014

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What about when our programs **go wrong?**







\$60 Billion a year in bugs

Therac 25



Mars Climate Orbiter



Patriot missile launcher

“10 historical software bugs with extreme consequences” –
Pingdom, March 19, 2009.

How do we verify software?

What do we need?

- **Program** — we want to talk about
- **Specification** — say when it's correct
- **Verification** — show program meets spec
- **Validation** — show system meets end to end goals

Probably basis of modern PL

- This is why **Robert Floyd** and **Tony Hoare** are famous

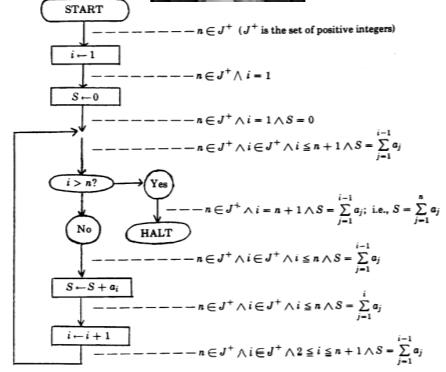


FIGURE 1. Flowchart of program t_0 to compute $S = \sum_{j=1}^n a_j$ ($n \geq 0$)



```

{ a = m   ∧   b = n   ∧   n ≥ 0 }
{ ab * 1 = mn   ∧   b ≥ 0 }
c := 1 ;
{ ab * c = mn   ∧   b ≥ 0 }
while b > 0
do
{ ab * c = mn   ∧   b ≥ 0   ∧   b > 0 }
while 2 * (b div 2) = b
do
{ ab * c = mn   ∧   b > 0   ∧   2 * (b div 2) = b }
{ a2*(b div 2) * c = mn   ∧   (b div 2) > 0 }
{ (a*a)b div 2 * c = mn   ∧   (b div 2) > 0 }
a := a * a ;
{ ab div 2 * c = mn   ∧   (b div 2) > 0 }
b := b div 2
{ ab * c = mn   ∧   b > 0 }
{ ab * c = mn   ∧   b > 0   ∧   2 * (b div 2) ≠ b }
{ ab * c = mn   ∧   b > 0 }
{ ab-1 * a * c = mn   ∧   b-1 ≥ 0 }
b := b - 1 ;
{ ab * a * c = mn   ∧   b ≥ 0 }
c := a * c
{ ab * c = mn   ∧   b ≥ 0 }
{ ab * c = mn   ∧   b ≥ 0   ∧   b ≤ 0 }
{ a0 * c = mn }
{ c = mn }

```

Bunch of different techniques

- Program logic
 - Compositionally build programs with **pre** and **post** conditions
- Model checking
 - Write what program **should** and **shouldn't** do
 - Check formula over **abstraction** of the program
- Program analysis
 - E.g., dataflow / control flow / abstract interpretation
 - “Is this pointer ever null?”

Preliminaries

- This is *intricate*
 - **Extremely complex** systems are **deceptively small**
 - Don't feel too insecure if it doesn't make sense
 - I'll be working a lot with the natural numbers.
 - `0 : nat`
 - `k : nat, S(k) : nat`
 - `S(k)` is `k + 1`
 - Lots of follow up work if you're interested

Use **types** as the specification

Program has type if it **satisfies** the property

Types are going to have to be more complex...

$$\lambda f.(\lambda x.f(xx))(\lambda x.f(xx))$$

Lambda calculus

Just do whatever...

2 *



=



Right?

| \rightarrow (typed) | | Based on λ (5-3) |
|-----------------------|---|---|
| Syntax | | |
| $t ::=$ | | |
| x | terms: | |
| $\lambda x:T.t$ | variable | |
| $t t$ | abstraction | |
| | application | |
| $v ::=$ | | |
| $\lambda x:T.t$ | values: | |
| | abstraction value | |
| $T ::=$ | | |
| $T \rightarrow T$ | types: | |
| | type of functions | |
| $\Gamma ::=$ | | |
| \emptyset | contexts: | |
| $\Gamma, x:T$ | empty context | |
| | term variable binding | |
| Evaluation | | |
| | | $t \rightarrow t'$ |
| | $\frac{t_1 \rightarrow t'_1}{t_1 t_2 \rightarrow t'_1 t_2}$ | (E-APP1) |
| | $\frac{t_2 \rightarrow t'_2}{v_1 t_2 \rightarrow v_1 t'_2}$ | (E-APP2) |
| | $(\lambda x:T_{11}.t_{12}) v_2 \rightarrow [x \mapsto v_2]t_{12}$ | (E-APPABS) |
| Typing | | $\boxed{\Gamma \vdash t : T}$ |
| | | $\frac{x:T \in \Gamma}{\Gamma \vdash x : T}$ (T-VAR) |
| | | $\frac{\Gamma, x:T_1 \vdash t_2 : T_2}{\Gamma \vdash \lambda x:T_1.t_2 : T_1 \rightarrow T_2}$ (T-ABS) |
| | | $\frac{\Gamma \vdash t_1 : T_{11} \rightarrow T_{12} \quad \Gamma \vdash t_2 : T_{11}}{\Gamma \vdash t_1 t_2 : T_{12}}$ (T-APP) |

Figure 9-1: Pure simply typed lambda-calculus (λ_{\rightarrow})

Typed Lambda

Warn about type errors

2 *



=

Error: * 2
applied to canine
when expected Int

```
type vector = int list

let rec add_vector a b =
  match (a,b) with
  | ([ ],[ ]) -> []
  | ((h1::t1),(h2::t2)) ->
    h1+h2 :: add_vector t1 t2
```

```
# add_vector [1;2;3] [1;2;3];;
- : int list = [2; 4; 6]
```

```
# add_vector [1;2;3] [1 3;4];;
Exception: Match failed at "/toplevel//", 26, 2).
```

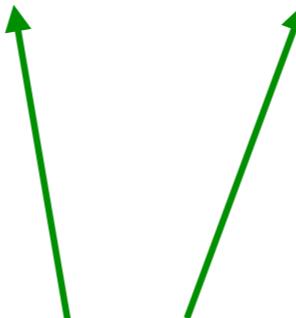


Why?

Use **types** as the **specification**

What's the specification...?

```
add_vector : vector -> vector -> vector
```



These need to be the same length

```
type (n : nat) vector =
```

Vectors of length n

A vector is a **type family**

vector :: *Nat* → *

Indexed by nat

“Give me a natural, and I’ll
give you back a type”

It is **very important** for you to realize
the difference between :: and :

$3 : nat$

$succ : nat \rightarrow nat$

All of the **terms** in our
language have a **type**.

[1,2] **WRONG** $Vector$

[1, 2] : $Vector2$

Vector is a type **producer operator**

vector :: *Nat* → *



This is called a **kind**

Kinds

Types have **kinds**

Types

Terms have **types**

$[1, 2] : Vector2$

We call **Vector n** a “dependent type”

(**Vector** is not a dependent type, it’s a kind...)

Because the type *depends* on **n**

Let's design a vector API

What can go wrong?

[MAIN MENU](#) [MY STORIES: 25](#) [FORUMS](#) [SUBSCRIBE](#) [JOBS](#)

RISK ASSESSMENT / SECURITY & HACKTIVISM

How Heartbleed transformed HTTPS security into the stuff of absurdist theater

Certificate revocation checking in browsers is "useless," crypto guru warns.

by Dan Goodin - Apr 21 2014, 6:44pm EDT

HACKING 58



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BLUISH CODER

PROGRAMMING LANGUAGES, MARTIALS ARTS AND COMPUTERS. THE WEBLOG OF CHRIS DOUBLE.

2014-04-11 Preventing heartbleed bugs with safe programming languages

The [Heartbleed bug](#) in OpenSSL has resulted in a fair amount of damage across the internet. The bug itself was [quite simple](#) and is a textbook case for why programming in unsafe languages like C can be problematic.

As an experiment to see if a safer systems programming language could have prevented the bug I tried rewriting the problematic function in the [ATS programming language](#). I've [written about ATS as a safer C](#) before. This gives a real world testcase for it. I used the latest version of ATS, called ATS2.

ATS compiles to C code. The function interfaces it generates can exactly match existing C functions and be callable from C. I used this feature to replace the `dtls1_process_heartbeat` and `tls1_process_heartbeat` functions in OpenSSL with ATS versions. These two functions are the ones that were patched to correct the heartbleed bug.

The approach I took was to follow something similar to that [outlined by John Skaller](#) on the ATS mailing list:

ATS on the other hand is basically C with a better type system.
You can write very low level C like code without a lot of the scary
dependent typing stuff and then you will have code like C, that
will crash if you make mistakes.

If you use the high level typing stuff coding is a lot more work
and requires more thinking, but you get much stronger assurances
of program correctness, stronger than you can get in Ocaml
or even Haskell, and you can even hope for *better* performance
than C by elision of run time checks otherwise considered mandatory,
due to proof of correctness from the type system. Expect over
50% of your code to be such proofs in critical software and probably
90% of your brain power to go into constructing them rather than
just implementing the algorithm. It's a paradigm shift.

Tags

| | |
|-------------------------------|----|
| acme | 1 |
| ajax | 7 |
| alice | 1 |
| ats | 25 |
| audio | 2 |
| b2g | 4 |
| backbase | 1 |
| bitcoin | 3 |
| bij | 1 |
| blackdog | 3 |
| commonlisp | 10 |
| concurrency | 4 |
| continuations | 10 |
| cyclone | 1 |
| dojo | 1 |
| eee | 1 |
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| factor | 60 |
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| flash | 1 |
| forth | 2 |
| fxos | 1 |
| git | 6 |
| gstreamer | 5 |
| happs | 2 |
| haskell | 14 |
| hyperscope | 1 |
| inferno | 6 |
| ... | ~ |

Things you might want to do with vectors...

Create an empty vector

Add an element to the end

Take a vector to a list

Add two vectors

Get first element of vector

Let the types be your guide

Seriously...

When you think about something you'd like to say about your program, you *can* bake it into your type system

Let's define two constructors for vectors

- Empty vector
- Cons

```
data list =
| []
| cons of nat -> list

(* Equivalently ... *)
nil : list
cons : nat -> list -> list
```

Same as lists, but lists don't carry
around their length in their type

“I assert that there is an object named
`zero`, and its type is `Vector 0`”

`zero : Vector 0`

cf.

`nil : list`

“Give me a vector of length n , and a number to add to the end of it, and I’ll give you a vector of length $S(n)$ ”

$$\begin{array}{c} cons : \prod n. Vector(n) \rightarrow \mathbb{N} \rightarrow Vector(S(n)) \\ \downarrow \text{cf.} \downarrow \\ cons : list \rightarrow nat \rightarrow list \end{array}$$

Now for a few functions...

“Give me a number n, and I’ll give you an empty vector of size n”

zero : $\prod n. Vector(n)$

Terms always need kind *, so we have to **apply** them until we get there! In this case n.

Read π as $\forall!!!$

This actually exists, by the way...

```
Inductive natvec : nat -> Type :=
| UnitVec : natvec 0
| ConsVec : forall n,
  natvec n -> nat -> natvec (S(n)).
```

```
Let a := ConsVec 1 (ConsVec 0 UnitVec 2) 3.
```

```
Fixpoint zero_vec n : natvec n :=
  match n with
  | 0      => UnitVec
  | S(n)  => ConsVec n (zero_vec n) 0
  end.
```

“For any n , if you give me a vector of size $S(n)$, I’ll give you back a natural.”

$\text{first} : \prod n : \mathbb{N}. \text{Vector}(S(n)) \rightarrow \mathbb{N}$

$S(n)$ because this guarantees
they can’t give us an empty
vector, *that’s the magic!*

This **isn’t** the strongest
spec possible

$$add : \prod n : \mathbb{N}. Vector(n) \rightarrow Vector(n) \rightarrow Vector(n)$$

What happens if I try to add
vectors of different lengths?

$\text{zero} : \Pi n. Vector(n)$

$\text{to_list} : \Pi n. Vector(n) \rightarrow list(\mathbb{N})$

$\text{cons} : \forall n. Vector(n) \rightarrow \mathbb{N} \rightarrow Vector(n + 1)$

$\text{first} : \Pi n. Vector(n + 1) \rightarrow \mathbb{N}$

$\text{add} : \forall n. Vector(n) \rightarrow Vector(n) \rightarrow Vector(n)$

Types are **Theorems**
Programs are **Proofs**

–Curry Howard Isomorphism

Every type is saying *something*...

23 : int

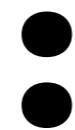
Proof that 23 is an integer

(Which is admittedly pretty boring...)

v : Vector 1

Proof that v has length 1

In other words, I don't have to be afraid that my program is going to crash if I run `first v`



Pretty cute

Let's define something else...

$$\leq :: \mathbb{N} \rightarrow \mathbb{N} \rightarrow *$$

How we define \leq

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

“Give me a number n, and I’ll give
you a proof it’s \leq itself”

le_n : $\Pi n. n \leq n$

“For any n and m, if you can give me a proof that $n \leq m$, then I’ll give you a proof that $n \leq S(m)$ ”

$$\text{le_S} : \prod n, m. n \leq m \rightarrow n \leq S(m)$$

I produce proofs

How do I prove that $0 \leq 1$?

What if I took a logic class IRL (I have)

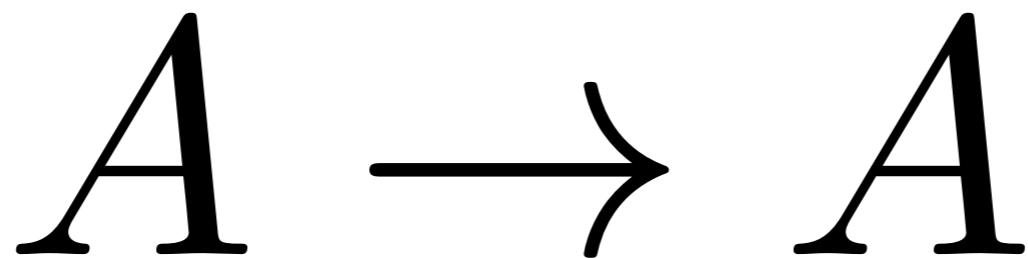
- “Well, zero is less than or equal to itself (**le_n 0**)
 - Let’s call that proof pf
- for any n less than or equal to itself, we have this rule that says S(n) is less than or equal to that thing (**le_S**)
- So now 0 is less than or equal to $S(0) = 1$ too (**le_S 0 1 pf**)
 - So now we know $0 \leq 1$
 - Can repeat for any finite $n \geq 0$.

Curry Howard Isomorphism

- Not that complicated: read types as theorems
- In math we have modus ponens

$$(A \Rightarrow B) \Rightarrow A \Rightarrow B$$

- In programming we have this function
 - $(A \rightarrow B) \rightarrow A \rightarrow B$
- Which we usually just call “apply” :)



What's a program that has this type?

$$(A \rightarrow B \rightarrow C) \rightarrow (A \rightarrow B) \rightarrow A \rightarrow C$$

Seriously, *modus ponens* is ***really just apply***

λ / app can **build the entire universe**

Two steps

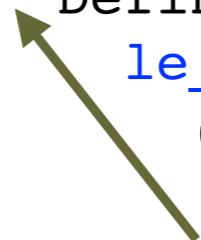
- Prove $0 \leq 0$
- Then **use** that proof to prove $0 \leq 1$

```
Definition zero_leq_one : 0 ≤ 1 :=  
  le_S 0 0 (le_n 0).
```

Computer is going to **check** proof for us

What about $0 \leq 2$

```
Definition zero_leq_two : 0 <= 2 :=  
  le_S 0 1  
  (le_S 0 0 (le_n 0)).
```



Automating it...

How do I prove that $n \leq k$

- Start with n ,
- keep adding **le_s**
 - a lot... ($10 \leq 1000$) — Going to need hundreds of apps of le_S
 - keep going
 - give up eventually

The computer can do magic

- Prove a theorem: guess proofs and see if they work
 - Slightly more complicated in reality (search strategy?)
 - Some decision procedures (e.g., omega test)

```
Theorem zero_leq_two' : 0 <= 2.
```

```
Proof.
```

```
auto.
```

```
Qed.
```

Just guess for proofs



$$(A \rightarrow B \rightarrow C) \rightarrow (A \rightarrow B) \rightarrow A \rightarrow C$$

Theorem a_b_c :

forall A B C,

$$(A \rightarrow B \rightarrow C) \rightarrow (A \rightarrow B) \rightarrow A \rightarrow C.$$

Proof.

auto.

Here's the proof!

Qed.

```
a_b_c = fun (A B C : Type)(X : A -> B -> C)
(X0 : A -> B) (X1 : A) =>
  X X1 (X0 X1)
```



```
: forall A B C : Type,
  (A -> B -> C) -> (A -> B) -> A -> C
```

Scale up to real projects: CompCert

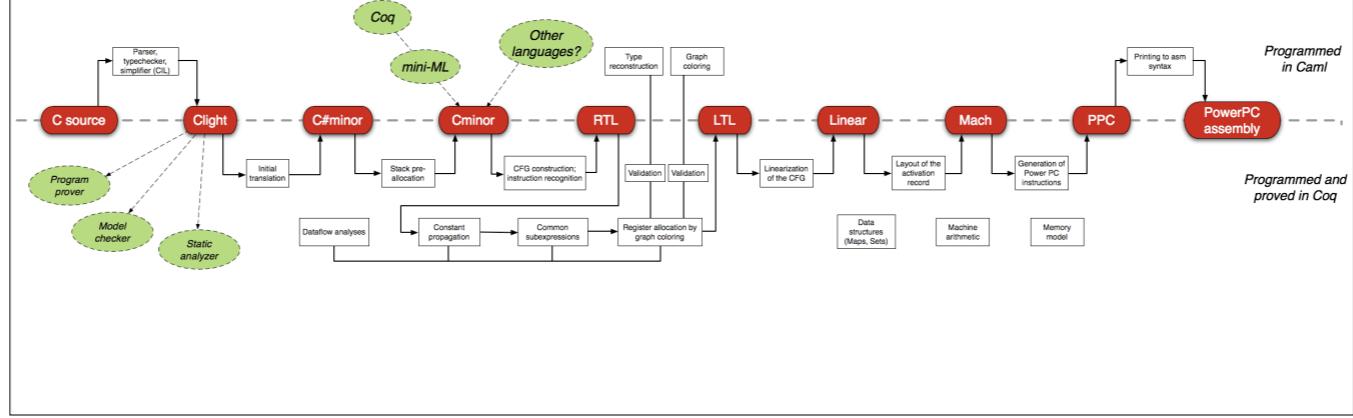
- Write logical specs for functions
- E.g., write a spec for a compiler
- Write specs for each *pass*
 - Prove translation of C to IR preserves semantics
- Chain together a bunch of small steps
 - **Prove a compiler correct**

```

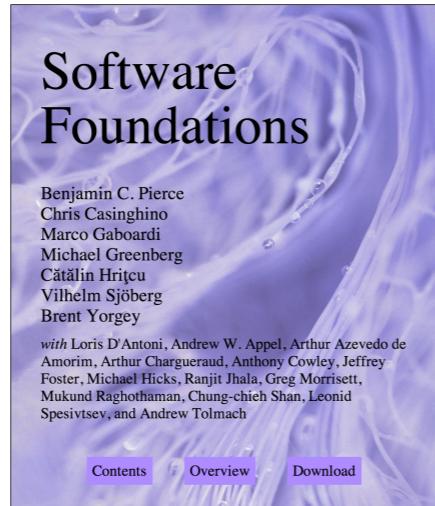
Theorem transf_c_program_is_refinement:
forall p tp,
transf_c_program p = OK tp ->
(forall beh, exec_C_program p beh -> not_wrong beh) ->
(forall beh, exec_asm_program tp beh -> exec_C_program p beh).

```

- 50kloc Coq source
- 8koc source — others are proofs
- **No errors**

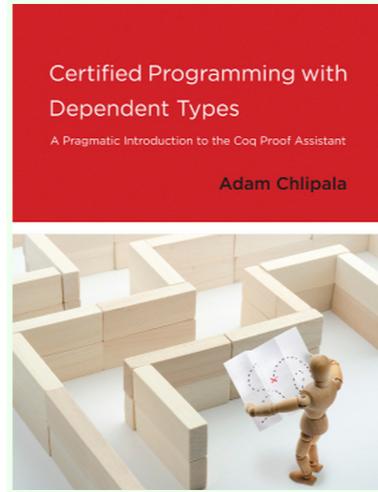


Where can I learn about this stuff!?



Suitable for beginners

<http://www.cis.upenn.edu/~bcpierce/sf/>
<http://adam.chlipala.net/cpdt/>



"Real" proof engineering

Auxiliary slides...

Just a quick run-through of LF...

λLF
Syntax

$$t ::= \begin{array}{l} x \\ \lambda x:T.t \\ t t \end{array}$$

$$T ::= \begin{array}{l} X \\ \Pi x:T.T \\ T t \end{array}$$

$$K ::= \begin{array}{l} * \\ \Pi x:T.K \end{array}$$

$$\Gamma ::= \begin{array}{l} \emptyset \\ \Gamma, x:T \\ \Gamma, X::K \end{array}$$

Well-formed kinds

$$\frac{\Gamma \vdash * \quad \boxed{\Gamma \vdash K}}{\Gamma \vdash \Pi x:T.K} \quad (\text{WF-PI})$$

$$\boxed{\Gamma \vdash K}$$

$$\begin{array}{c} \text{terms:} \\ \text{variable} \\ \text{abstraction} \\ \text{application} \end{array}$$

$$\begin{array}{c} \text{types:} \\ \text{type/family variable} \\ \text{dependent product type} \\ \text{type family application} \end{array}$$

$$\begin{array}{c} \text{kinds:} \\ \text{kind of proper types} \\ \text{kind of type families} \end{array}$$

$$\begin{array}{c} \text{contexts:} \\ \text{empty context} \\ \text{term variable binding} \\ \text{type variable binding} \end{array}$$

Kinding

$$\frac{X :: K \in \Gamma \quad \Gamma \vdash K}{\Gamma \vdash X :: K} \quad (\text{K-VAR})$$

$$\frac{\Gamma \vdash T_1 :: * \quad \Gamma, x:T_1 \vdash T_2 :: *}{\Gamma \vdash \Pi x:T_1.T_2 :: *} \quad (\text{K-PI})$$

$$\frac{\Gamma \vdash S :: \Pi x:T.K \quad \Gamma \vdash t : T}{\Gamma \vdash S t : [x \mapsto t]K} \quad (\text{K-APP})$$

$$\frac{\Gamma \vdash T :: K \quad \Gamma \vdash K \equiv K'}{\Gamma \vdash T :: K'} \quad (\text{K-CONV})$$

Typing

$$\frac{x:T \in \Gamma \quad \Gamma \vdash T :: *}{\Gamma \vdash x : T} \quad (\text{T-VAR})$$

$$\frac{\Gamma \vdash S :: * \quad \Gamma, x:S \vdash t : T}{\Gamma \vdash \lambda x:S.t : \Pi x:S.T} \quad (\text{T-ABS})$$

$$\frac{\Gamma \vdash t_1 : \Pi x:S.T \quad \Gamma \vdash t_2 : S}{\Gamma \vdash t_1 t_2 : [x \mapsto t_2]T} \quad (\text{T-APP})$$

$$\frac{\Gamma \vdash t : T \quad \Gamma \vdash T \equiv T' :: *}{\Gamma \vdash t : T'} \quad (\text{T-CONV})$$

Figure 2-1: First-order dependent types (λLF)

| λLF | | (Mostly) Lambda |
|--|--|--------------------------------|
| <i>Syntax</i> | | |
| $t ::=$ | <i>terms:</i> variable abstraction application | |
| x | | |
| $\lambda x:T.t$ | | |
| $t t$ | | |
| $T ::=$ | <i>types:</i> type/family variable dependent product type type family application | |
| X | | |
| $\Pi x:T.T$ | | |
| $T t$ | | |
| $K ::=$ | <i>kinds:</i> kind of proper types kind of type families | |
| $*$ | | |
| $\Pi x:T.K$ | | |
| $\Gamma ::=$ | <i>contexts:</i> empty context term variable binding type variable binding | |
| \emptyset | | |
| $\Gamma, x:T$ | | |
| $\Gamma, X::K$ | | |
| <i>Well-formed kinds</i> | | $\boxed{\Gamma \vdash K}$ |
| $\Gamma \vdash *$ | $\boxed{(\text{WF-STAR})}$ | |
| $\frac{\Gamma \vdash T :: * \quad \Gamma, x:T \vdash K}{\Gamma \vdash \Pi x:T.K}$ | | $\boxed{(\text{WF-PI})}$ |
| <i>Kinding</i> | | $\boxed{\Gamma \vdash T :: K}$ |
| $\frac{X :: K \in \Gamma \quad \Gamma \vdash K}{\Gamma \vdash X :: K}$ | | (K-VAR) |
| $\frac{\Gamma \vdash T_1 :: * \quad \Gamma, x:T_1 \vdash T_2 :: *}{\Gamma \vdash \Pi x:T_1.T_2 :: *}$ | | (K-PI) |
| $\frac{\Gamma \vdash S :: \Pi x:T.K \quad \Gamma \vdash t : T}{\Gamma \vdash S t : [x \mapsto t]K}$ | | (K-APP) |
| $\frac{\Gamma \vdash T :: K \quad \Gamma \vdash K \equiv K'}{\Gamma \vdash T :: K'}$ | | (K-CONV) |
| <i>Typing</i> | | $\boxed{\Gamma \vdash t : T}$ |
| $\frac{x:T \in \Gamma \quad \Gamma \vdash T :: *}{\Gamma \vdash x : T}$ | | (T-VAR) |
| $\frac{\Gamma \vdash S :: * \quad \Gamma, x:S \vdash t : T}{\Gamma \vdash \lambda x:S.t : \Pi x:S.T}$ | | (T-ABS) |
| $\frac{\Gamma \vdash t_1 : \Pi x:S.T \quad \Gamma \vdash t_2 : S}{\Gamma \vdash t_1 t_2 : [x \mapsto t_2]T}$ | | (T-APP) |
| $\frac{\Gamma \vdash t : T \quad \Gamma \vdash T \equiv T' :: *}{\Gamma \vdash t : T'}$ | | (T-CONV) |

Figure 2-1: First-order dependent types (λLF)

λLF

| Syntax | | Kinding | |
|-------------------|--------------------------------|--|--------------------------------|
| $t ::=$ | <i>terms:</i> | | $\boxed{\Gamma \vdash T :: K}$ |
| x | <i>variable</i> | $\frac{X :: K \in \Gamma \quad \Gamma \vdash K}{\Gamma \vdash X :: K}$ | (K-VAR) |
| $\lambda x:T.t$ | <i>abstraction</i> | | |
| $t t$ | <i>application</i> | $\frac{\Gamma \vdash T_1 :: * \quad \Gamma, x:T_1 \vdash T_2 :: *}{\Gamma \vdash \Pi x:T_1.T_2 :: *}$ | (K-PI) |
| $T ::=$ | <i>types:</i> | | |
| X | <i>type/family variable</i> | $\frac{\Gamma \vdash S :: \Pi x:T.K \quad \Gamma \vdash t : T}{\Gamma \vdash S t : [x \mapsto t]K}$ | (K-APP) |
| $\Pi x:T.T$ | <i>dependent product type</i> | | |
| $T t$ | <i>type family application</i> | $\frac{\Gamma \vdash T :: K \quad \Gamma \vdash K \equiv K'}{\Gamma \vdash T :: K'}$ | (K-CONV) |
| $K ::=$ | <i>kinds:</i> | | |
| $*$ | <i>kind of proper types</i> | | |
| $\Pi x:T.K$ | <i>kind of type families</i> | | |
| $\Gamma ::=$ | <i>contexts:</i> | | |
| \emptyset | <i>empty context</i> | | |
| $\Gamma, x:T$ | <i>term variable binding</i> | $\frac{x:T \in \Gamma \quad \Gamma \vdash T :: *}{\Gamma \vdash x : T}$ | (T-VAR) |
| $\Gamma, X::K$ | <i>type variable binding</i> | | |
| Well-formed kinds | | $\boxed{\Gamma \vdash K}$ | |
| | | $\frac{\Gamma \vdash *}{\Gamma \vdash \Pi x:T.K}$ | (WF-PI) |
| | | $\frac{\Gamma \vdash T :: * \quad \Gamma, x:T \vdash K}{\Gamma \vdash \Pi x:T.K}$ | (WF-STAR) |
| Typing | | | |
| | | $\boxed{\Gamma \vdash t : T}$ | |
| | | $\frac{\Gamma \vdash S :: * \quad \Gamma, x:S \vdash t : T}{\Gamma \vdash \lambda x:S.t : \Pi x:S.T}$ | (T-ABS) |
| | | $\frac{\Gamma \vdash t_1 : \Pi x:S.T \quad \Gamma \vdash t_2 : S}{\Gamma \vdash t_1 t_2 : [x \mapsto t_2]T}$ | (T-APP) |
| | | $\frac{\Gamma \vdash t : T \quad \Gamma \vdash T \equiv T' :: *}{\Gamma \vdash t : T'}$ | (T-CONV) |

Figure 2-1: First-order dependent types (λLF)