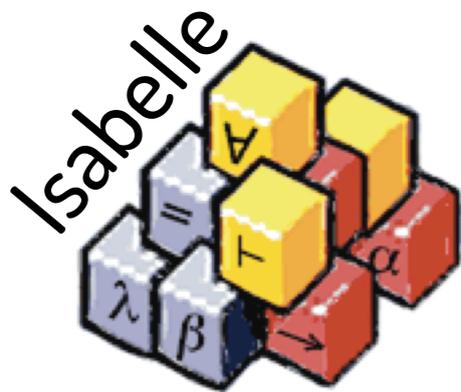
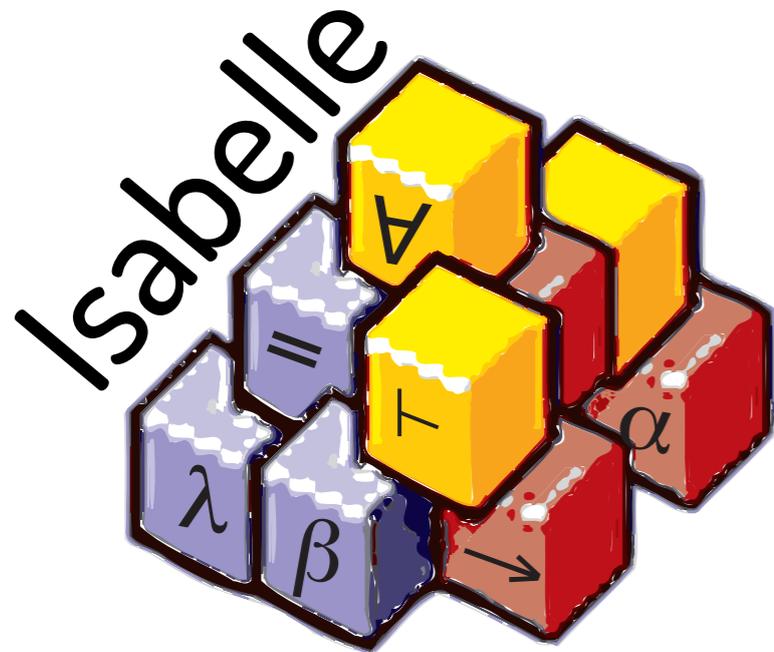


# Robust, Semi-Intelligible Isabelle Proofs from ATP Proofs



Steffen Juilf Smolka  
Jasmin Christian Blanchette

# ITPs



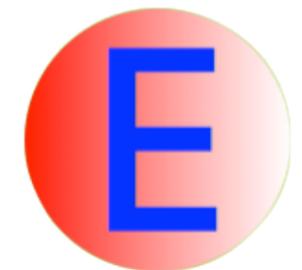
vs.

# ATPs



**V**ampire

**LEO-II**



**SATALLAX**

well suited for  
large formalizations

but

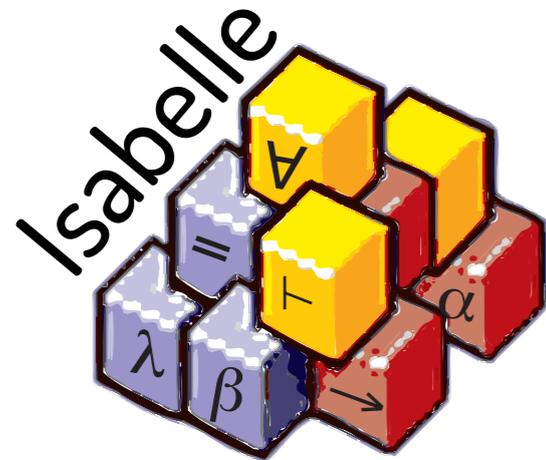
require intensive  
manual labor

fully automatic

but

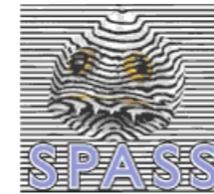
no proof  
management

# ITPs



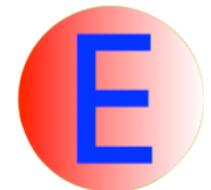
**Sledge-  
hammer**

# ATPs



**V**ampire

**LEO-II**



**SATALLAX**

well suited for  
large formalizations  
but  
require intensive  
manual labor

fully automatic  
but  
no proof  
management

Scratch.thy (~/)

```
lemma "length (tl xs) ≤ length xs"
```

```
proof (prove): step 0
```

```
goal (1 subgoal):
```

```
1. length (tl xs) ≤ length xs
```

100%

 Auto update

Update

Detach



Output

Raw Output

README

Symbols

```
lemma "length (tl xs) ≤ length xs"  
sledgehammer
```

Buttons: Close (X), Arrow, Sidekick, Theories

100%  Auto update Update Detach

Sledgehammering...

Buttons: Close (X), Arrow, Output, Raw Output, README, Symbols

```
lemma "length (tl xs) ≤ length xs"  
sledgehammer
```

100%

 Auto update

Update

Detach

Sledgehammering...

```
"spass": Try this: by (metis diff_le_self length_tl) (17 ms).
```



Output

Raw Output

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Symbols

```
lemma "length (tl xs) ≤ length xs"  
sledgehammer
```

100%

 Auto update

Update

Detach

Sledgehammering...

"spass": Try this: `by (metis diff_length_tl)` (17 ms).



Output

Raw Output

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```
lemma "length (tl xs) ≤ length xs"  
by (metis diff_le_self length_tl)
```

100%

 Auto update

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Exploit ATPs,  
but don't trust them.

## LCF Principle (Robin Milner):

Have all proofs checked by the  
inference kernel.

⇒ ATP proofs must be **reconstructed** in Isabelle.



## Approach A: Metis One-Liners

**Lemma** "length (tl xs) ≤ length xs"  
**by** (metis diff\_le\_self length\_tl)

**proof method**



**lemmas**



## Approach A: Metis One-Liners

**Lemma** "length (tl xs) ≤ length xs"  
**by** (metis diff\_le\_self length\_tl)

↑  
**proof method**

↙ ↘  
**lemmas**

**external ATPs:** find proof  
given 100s of facts

**Metis:** re-find proof given  
only necessary facts

## Approach A: Metis One-Liners

**Lemma** "length (tl xs) ≤ length xs"  
**by** (metis diff\_le\_self length\_tl)

↑  
**proof method**

← →  
**lemmas**

**external ATPs:** find proof  
given 100s of facts

**Metis:** re-find proof given  
only necessary facts

+ usually fast and reliable

+ lightweight

- cryptic

- sometimes slow (several seconds)

- on avg. 5% > 30 seconds

# Approach B: Detailed Isar Proofs

```
lemma "length (tl xs) ≤ length xs"
proof -
  have "∧x1 x2. (x1::nat) - x2 - x1 = 0 - x2"
    by (metis comm_monoid_diff_class.diff_cancel diff_right_commute)
  hence "length xs - 1 - length xs = 0"
    by (metis zero_diff)
  hence "length xs - 1 ≤ length xs"
    by (metis diff_is_0_eq)
  thus "length (tl xs) ≤ length xs"
    by (metis length_tl)
qed
```

# Approach B: Detailed Isar Proofs

```
lemma "length (tl xs) ≤ length xs"
proof -
  have "∧x1 x2. (x1::nat) - x2 - x1 = 0 - x2"
    by (metis comm_monoid_diff_class.diff_cancel diff_right_commute)
  hence "length xs - 1 - length xs = 0"
    by (metis zero_diff)
  hence "length xs - 1 ≤ length xs"
    by (metis diff_is_0_eq)
  thus "length (tl xs) ≤ length xs"
    by (metis length_tl)
qed
```

+ faster than one-liners

+ 100% reconstruction (in principle)

+ self-explanatory

- technically more challenging

## Challenge 1:

Resolution proofs are by contradiction

"sin against mathematical exposition" (Knuth et al. 1989)

→ Jasmin Blanchette

## Challenge 2:

Skolemization - introduce new symbols during proof

## Challenge 3:

Type Annotations - make Isabelle understand its own output

## Challenge 4:

Preplay & Compression - test and optimize proofs

# Challenge 2:

# Skolemization

$$\frac{\forall X. \exists Y. p(X, Y)}{\forall X. p(X, y(X))}$$

Skolemization

↑  
Signature is extended

$$\frac{\forall X. \exists Y. p(X, Y)}{\forall X. p(X, y(X))}$$

Skolemization

  
 Signature is extended

$$\frac{\forall X. \exists Y. p(X, Y)}{\exists y. \forall X. p(X, y(X))}$$

Ax. of Choice

$$\frac{\forall X. \exists Y. p(X, Y)}{\forall X. p(X, y(X))}$$

Skolemization

↑  
Signature is extended

$$\frac{\forall X. \exists Y. p(X, Y)}{\exists y. \forall X. p(X, y(X))}$$

Ax. of Choice

Signature is extended

↓  
*obtain* **y** where  $\forall X. p(X, y(X))$

<steps with **reduced** sig.>

$$\frac{\forall X. \exists Y. p(X, Y)}{\exists y. \forall X. p(X, y(X))} \quad \text{Ax. of Choice}$$

<steps with **extended** sig.>

<steps with **extended** sig.>

$$\frac{\exists y. \forall X. p(X, y(X))}{\forall X. \exists Y. p(X, Y)} \quad \text{Ax. of Choice}$$

<steps with **reduced** sig.>

<steps with **extended** sig.>

$$\frac{\forall y. \exists X. \neg p(X, y(X))}{\exists X. \forall Y. \neg p(X, Y)} \quad \text{Ax. of Choice}$$

<steps with **reduced** sig.>

<steps with **extended** sig.>

$$\frac{\forall y. \exists X. \neg p(X, y(X))}{\exists X. \forall Y. \neg p(X, Y)} \quad \begin{array}{l} \text{Contrap. of} \\ \text{Ax. of Choice} \end{array}$$

<steps with **reduced** sig.>

<steps with **extended** sig.>

$$\frac{\forall y. \exists X. \neg p(X, y(X))}{\exists X. \forall Y. \neg p(X, Y)} \quad \begin{array}{l} \text{Contrap. of} \\ \text{Ax. of Choice} \end{array}$$

<steps with **reduced** sig.>

{ fix  $y$

<steps with **extended** sig.>

have  $\exists X. \neg p(X, y(X))$  }

hence  $\exists X. \forall Y. \neg p(X, Y)$

<steps with **reduced** sig.>

# Challenge 3:

## Type Annotations

Make Isabelle understand its own output

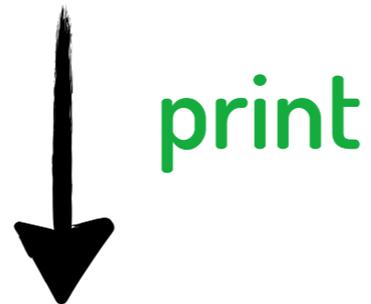
**2**nat + nat→nat→nat **2**nat = nat→nat→bool **4**nat



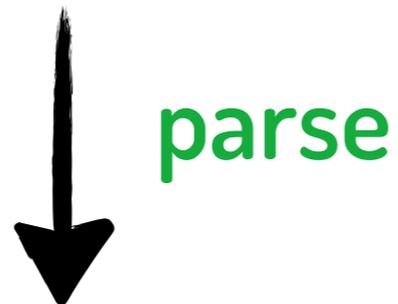
print

**2 + 2 = 4**

$2^{\text{nat}}$   $+^{\text{nat} \rightarrow \text{nat} \rightarrow \text{nat}}$   $2^{\text{nat}}$   $=^{\text{nat} \rightarrow \text{nat} \rightarrow \text{bool}}$   $4^{\text{nat}}$



$2 + 2 = 4$

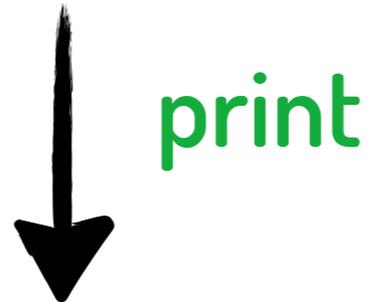


$2^{\alpha}$   $+^{\alpha \rightarrow \alpha \rightarrow \alpha}$   $2^{\alpha}$   $=^{\alpha \rightarrow \alpha \rightarrow \text{bool}}$   $4^{\alpha}$

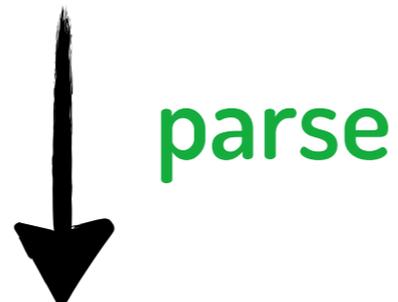
where  $\alpha : \text{numeral}$

**Un-  
provable**

**2**<sup>nat</sup> **+**<sup>nat→nat→nat</sup> **2**<sup>nat</sup> **=**<sup>nat→nat→bool</sup> **4**<sup>nat</sup>

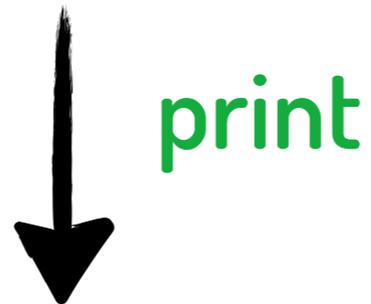


**(2:nat)** **(+ : nat→nat→nat)** **(2:nat)**  
**(= : nat→nat→bool)** **(4:nat)**



**2**<sup>nat</sup> **+**<sup>nat→nat→nat</sup> **2**<sup>nat</sup> **=**<sup>nat→nat→bool</sup> **4**<sup>nat</sup>

$2^{\text{nat}}$   $+$   $\text{nat} \rightarrow \text{nat} \rightarrow \text{nat}$   $2^{\text{nat}}$   $=$   $\text{nat} \rightarrow \text{nat} \rightarrow \text{bool}$   $4^{\text{nat}}$



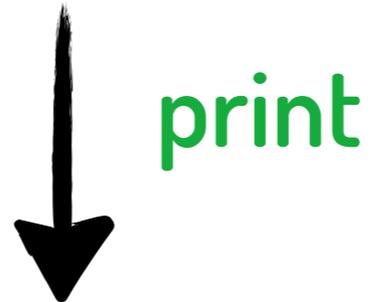
$2 + 2 = 4$



$2^{\alpha}$   $+$   $\alpha \rightarrow \alpha \rightarrow \alpha$   $2^{\alpha}$   $=$   $\alpha \rightarrow \alpha \rightarrow \text{bool}$   $4^{\alpha}$

where  $\alpha : \text{numeral}$

**2**<sup>nat</sup> +<sup>nat→nat→nat</sup> **2**<sup>nat</sup> =<sup>nat→nat→bool</sup> **4**<sup>nat</sup>



**(2:nat)** + **2** = **4**



**2**<sup>nat</sup> +<sup>nat→nat→nat</sup> **2**<sup>nat</sup> =<sup>nat→nat→bool</sup> **4**<sup>nat</sup>

**Goal:** Calculate a set of annotations that is

**(A) Complete:** reparsing term must not change its type

**(B) Minimal:** annotations must impair readability as little as possible

$f^{\text{nat} \rightarrow \text{int} \rightarrow \text{bool}}$   $x^{\text{nat}}$   $y^{\text{int}}$

type erasure  
 $\approx$  printing

$f^-$   $x^-$   $y^-$

type inference  
 $\approx$  parsing

$f^{\alpha \rightarrow \beta \rightarrow \gamma}$   $x^\alpha$   $y^\beta$

matching

$\sigma = \{ \alpha \mapsto \text{nat}, \beta \mapsto \text{int}, \gamma \mapsto \text{bool} \}$

$f^{\text{nat} \rightarrow \text{int} \rightarrow \text{bool}}$     $x^{\text{nat}}$     $y^{\text{int}}$

type erasure  
 $\approx$  printing

$f^-$     $x^-$     $y^-$

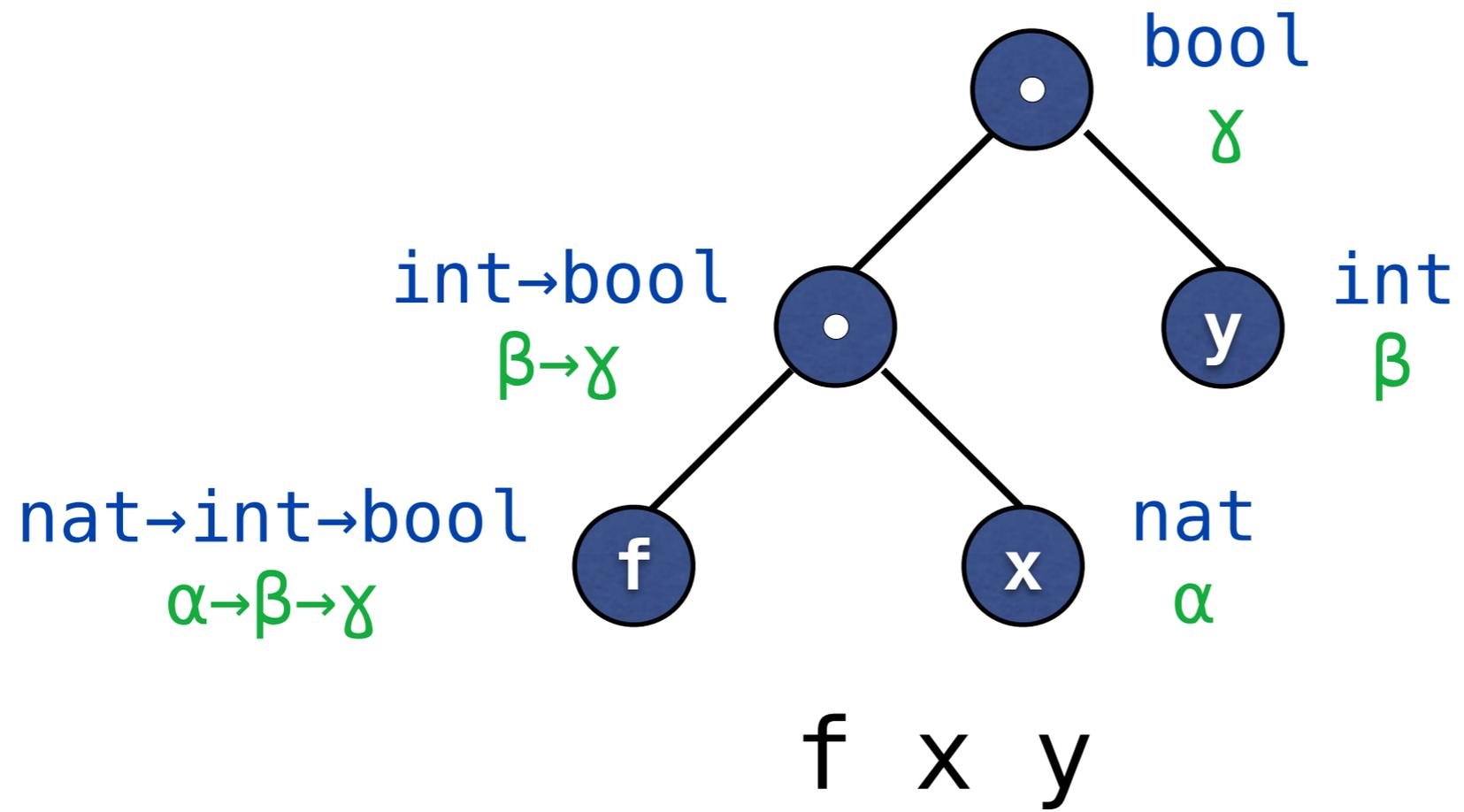
type inference  
 $\approx$  parsing

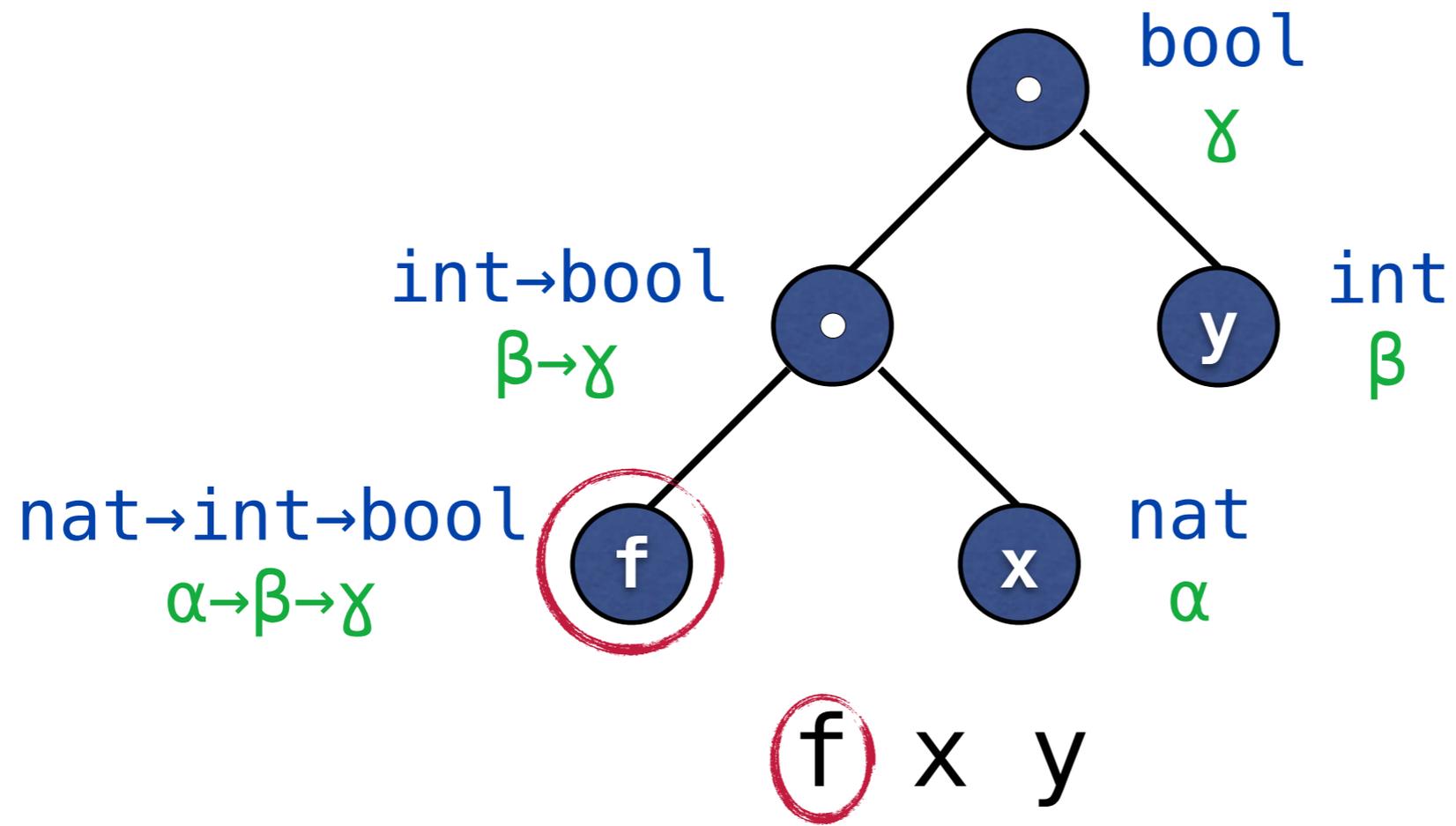
$f^{\alpha \rightarrow \beta \rightarrow \gamma}$     $x^\alpha$     $y^\beta$

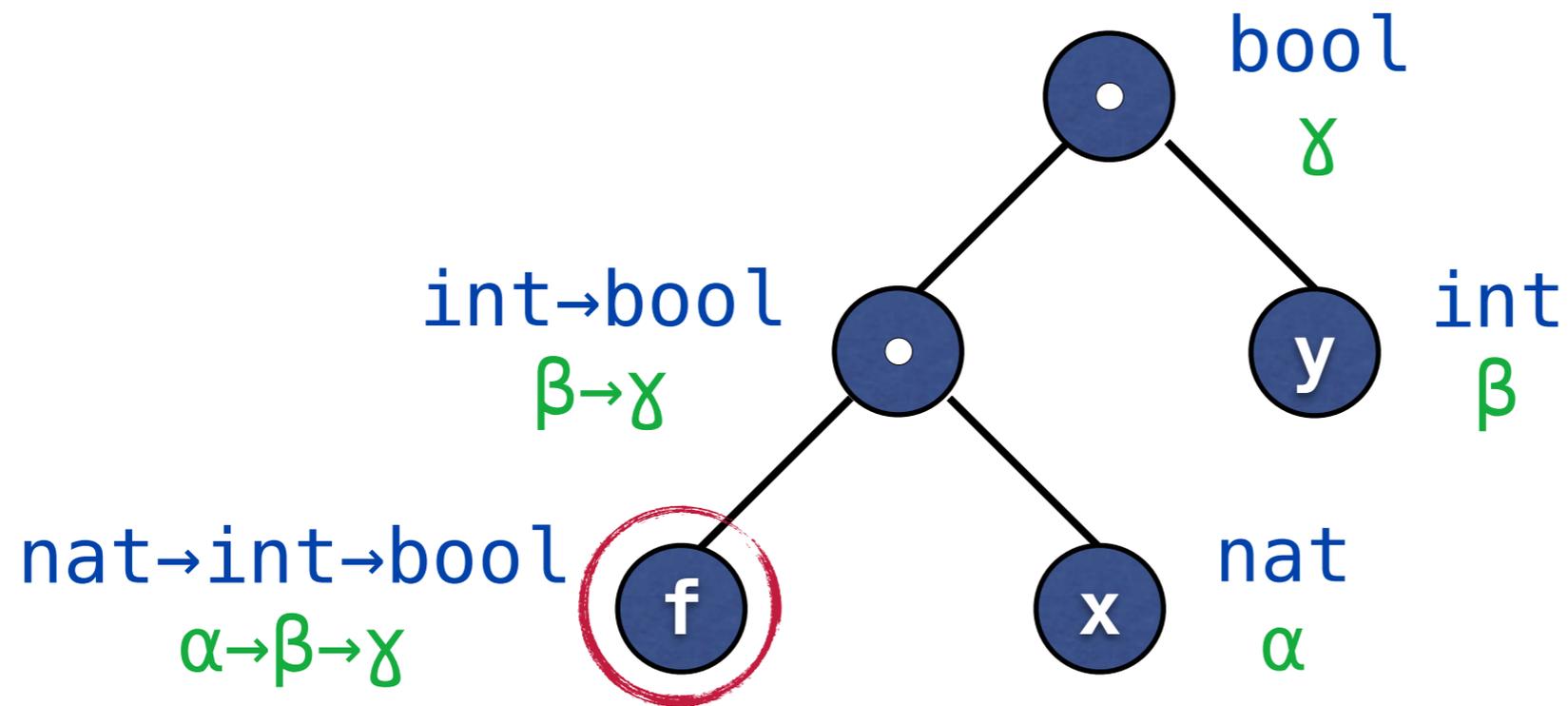
matching

$\sigma = \{ \alpha \mapsto \text{nat}, \beta \mapsto \text{int}, \gamma \mapsto \text{bool} \}$

Set of ann. complete   IFF   it covers  $\text{Dom}(\sigma)$

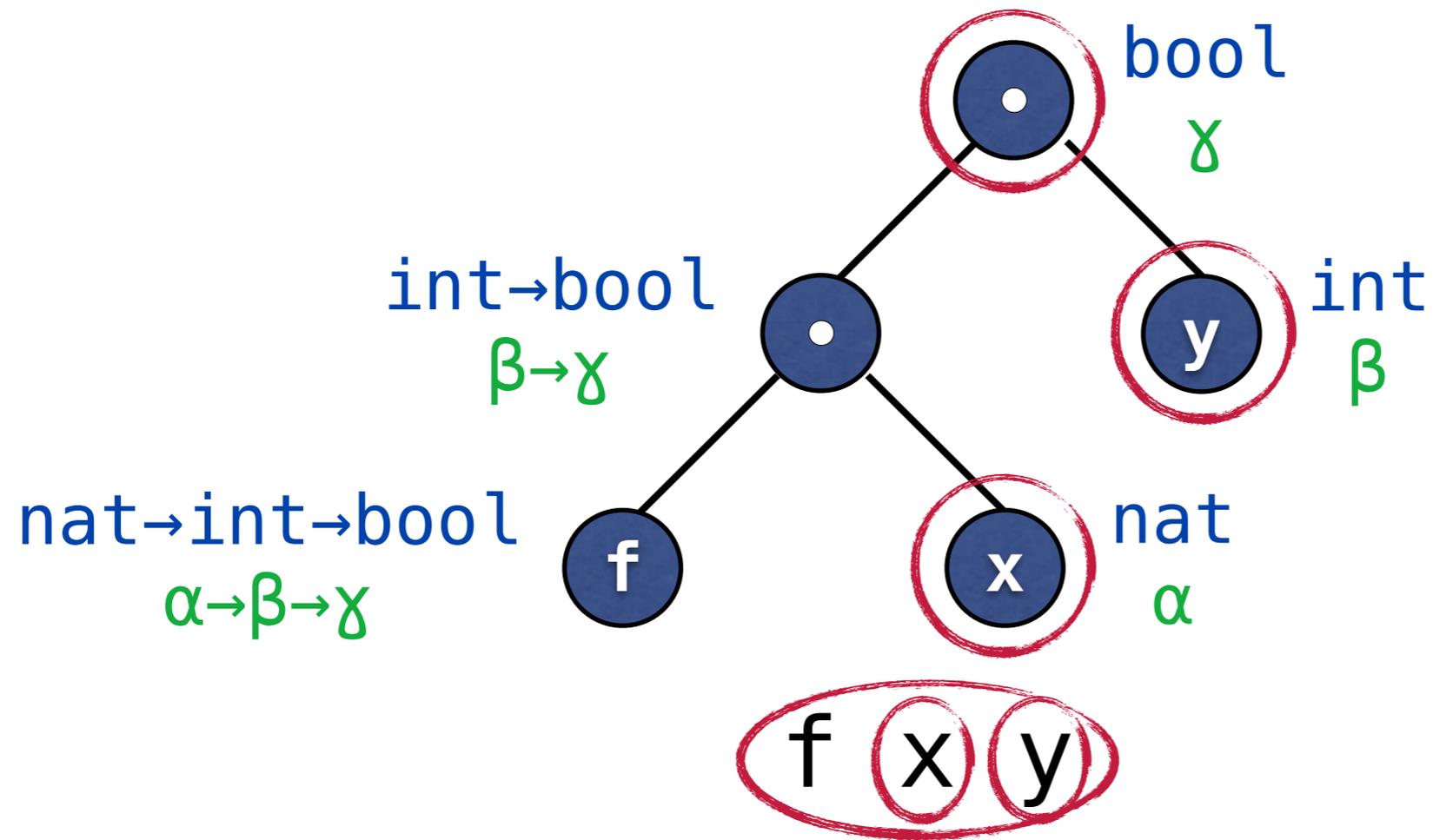




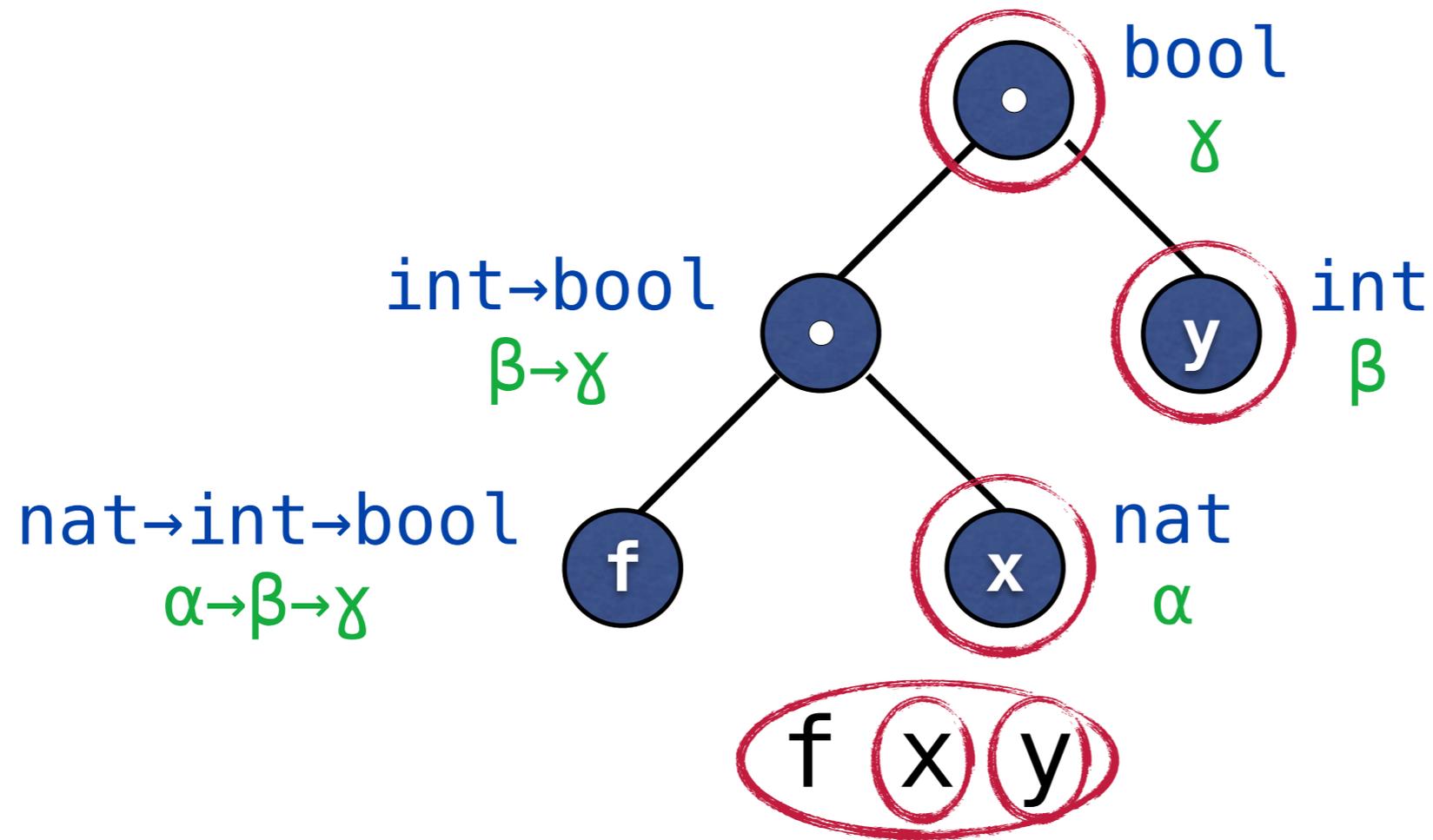


$f$   $x$   $y$

$(f : \text{nat} \rightarrow \text{int} \rightarrow \text{bool}) \ x \ y$

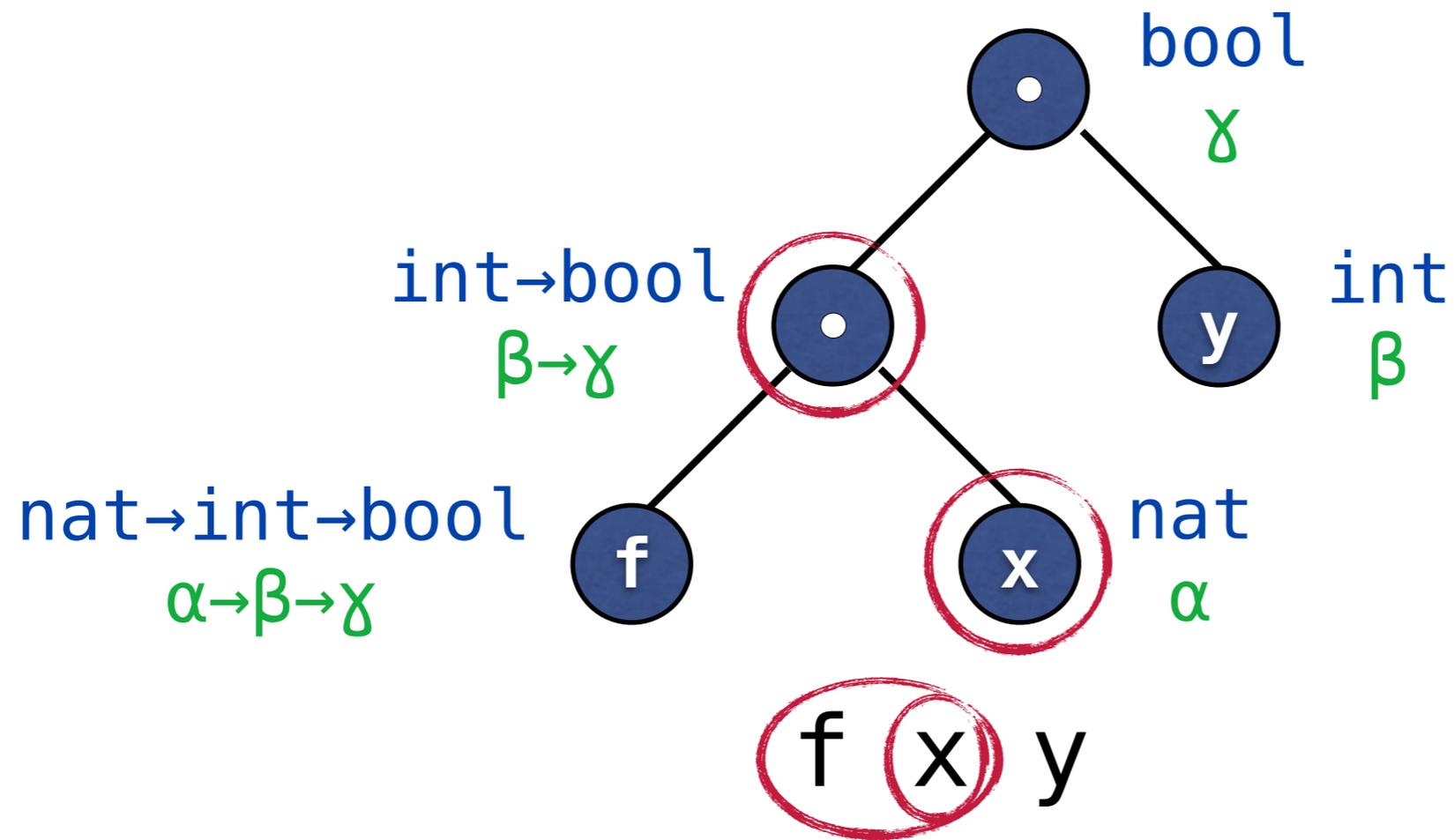


$(f : \text{nat} \rightarrow \text{int} \rightarrow \text{bool}) \ x \ y$



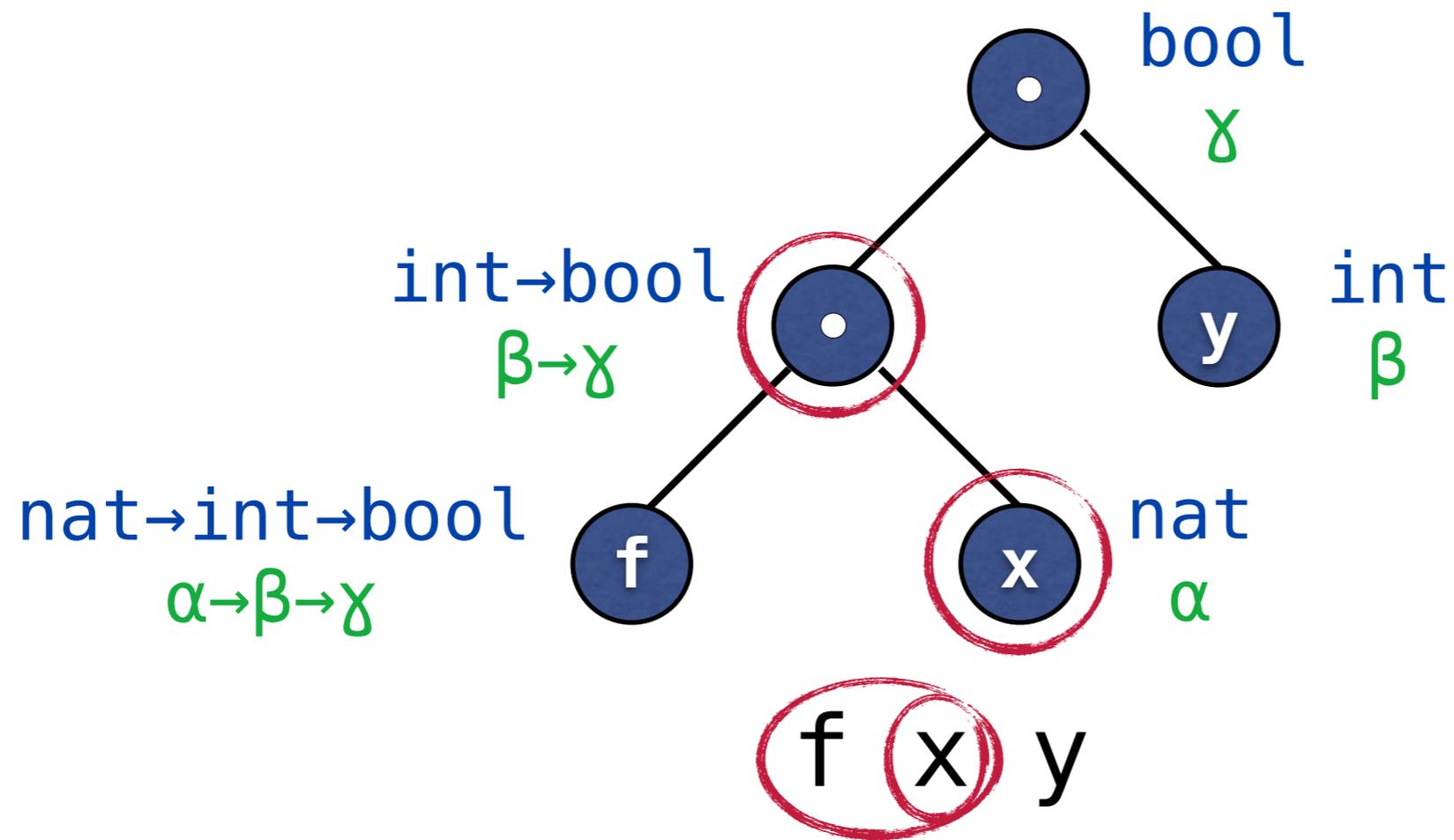
$(f : \text{nat} \rightarrow \text{int} \rightarrow \text{bool}) \ x \ y$

$f \ (x : \text{nat}) \ (y : \text{int}) : \text{bool}$



$(f : \text{nat} \rightarrow \text{int} \rightarrow \text{bool}) \ x \ y$

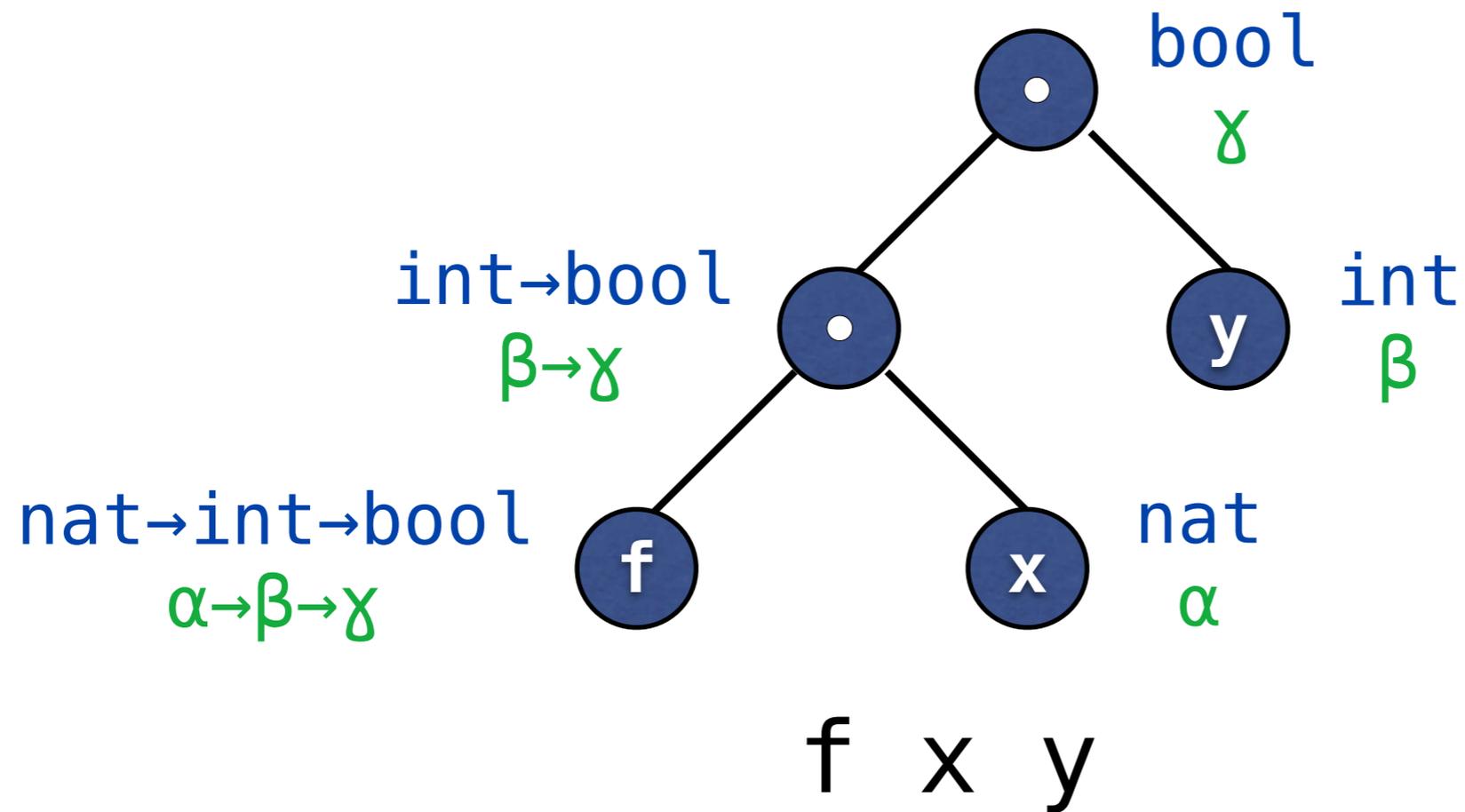
$f \ (x : \text{nat}) \ (y : \text{int}) : \text{bool}$



$(f : \text{nat} \rightarrow \text{int} \rightarrow \text{bool}) \ x \ y$

$f \ (x : \text{nat}) \ (y : \text{int}) : \text{bool}$

$(f \ (x : \text{nat}) : \text{int} \rightarrow \text{bool}) \ y$



$(f : \text{nat} \rightarrow \text{int} \rightarrow \text{bool}) \ x \ y$

$f \ (x : \text{nat}) \ (y : \text{int}) : \text{bool}$

$(f \ (x : \text{nat}) : \text{int} \rightarrow \text{bool}) \ y$

**Which set of annotations is the best?**

**How do we compute it efficiently?**

Which set of annotations is the best?

cost of  $t^\tau$  :=

Which set of annotations is the best?

cost of  $t^\tau :=$

(size of  $\tau,$

→ small annotations

## Which set of annotations is the best?

**cost of  $t^\tau$  :=**

(size of  $\tau$ ,

size of  $t$ ,

→ small annotations

→ small annotated terms

## Which set of annotations is the best?

**cost of  $t^\tau$  :=**

size of  $\tau$ ,

size of  $t$ ,

postindex of  $t^\tau$ )

→ small annotations

→ small annotated terms

→ annotations at the beginning

## Which set of annotations is the best?

**cost of  $t^\tau$  :=**

(size of  $\tau$ ,

→ small annotations

size of  $t$ ,

→ small annotated terms

postindex of  $t^\tau$ )

→ annotations at the beginning

≤ lexicographically  
+ component-wise

**How do we compute it efficiently?**

# How do we compute it efficiently?

Instance of **Weighted Set Cover Problem**:

- Finite Universe  $U$  →  $\text{Dom}(\sigma)$
- Family  $S \subseteq 2^U$  → Possible Annotations

# How do we compute it efficiently?

Instance of **Weighted Set Cover Problem**:

- Finite Universe  $U$  →  $\text{Dom}(\sigma)$
- Family  $S \subseteq 2^U$  → Possible Annotations
- Find  $\{U_1, \dots, U_n\} \subseteq S$  such that
  - ▶  $U_1 \cup \dots \cup U_n = U$  → Completeness
  - ▶  $\text{cost} \{U_1, \dots, U_n\}$  minimal → Readability

SCP is **NP-complete**  $\implies$  settle for Approximation

**Reverse-Greedy Alg.** calculates local min:

- ▶ start with all annotations
- ▶ repeatedly remove the most expensive superfluous annotation

# Challenge 4:

Preplay & Compression

# Proof Preplay

Generated proofs are only useful if they...

- work
- are reasonably fast

# Proof Preplay

Generated proofs are only useful if they...

- work
- are reasonably fast

Let the computer find out!

→ Present proofs with “preplay” information

**Lemma** " $x \sqcup -x = -x \sqcup -(-x)$ "

**sledgehammer**

Sidekick

100%

Auto update

Update

Detach

Sledgehammering...

▼

Output

Raw Output

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Lemma "x ⊔ -x = -x ⊔ -(-x)"

sledgehammer

100%

Auto update

Update

Detach

Try this: by (metis huntington sup\_assoc sup\_comm) (> 3 s).

timeout



Output

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Lemma " $x \sqcup -x = -x \sqcup -(-x)$ "

sledgehammer

100%

 Auto update

Update

Detach

Try this: by (metis huntington sup\_assoc sup\_comm) (**> 3 s**).

Structured proof (43 steps, **1.34 s**):

**timeout**

proof -

have f1: " $\wedge x_1 x_2. - (- x_1 \sqcup x_2) \sqcup - (- x_1 \sqcup - x_2) = x_1$ "

by (metis huntington sup\_comm)

have f2: " $\wedge x_1 x_2 x_3. x_1 \sqcup (x_2 \sqcup x_3) = x_3 \sqcup (x_1 \sqcup x_2)$ "

by (metis sup\_assoc sup\_comm)

have f3: " $\wedge x_1 x_2 x_3. x_1 \sqcup (x_2 \sqcup x_3) = x_2 \sqcup x_1 \sqcup x_3$ "

by (metis sup\_assoc sup\_comm)

have f4: " $\wedge x_1 x_2 x_3. x_1 \sqcup (x_2 \sqcup x_3) = x_3 \sqcup (x_2 \sqcup x_1)$ "



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## **Approach A:** Feed proof text to Isabelle

+ close to reality

- expensive

- no timings for individual steps

**Approach A:** Feed proof text to Isabelle

+ close to reality

- expensive

- no timings for individual steps

**Approach B:** Simulate replay on ML-level

- not the real thing (no printing, no parsing)

+ timings for each step

# Proof Compression

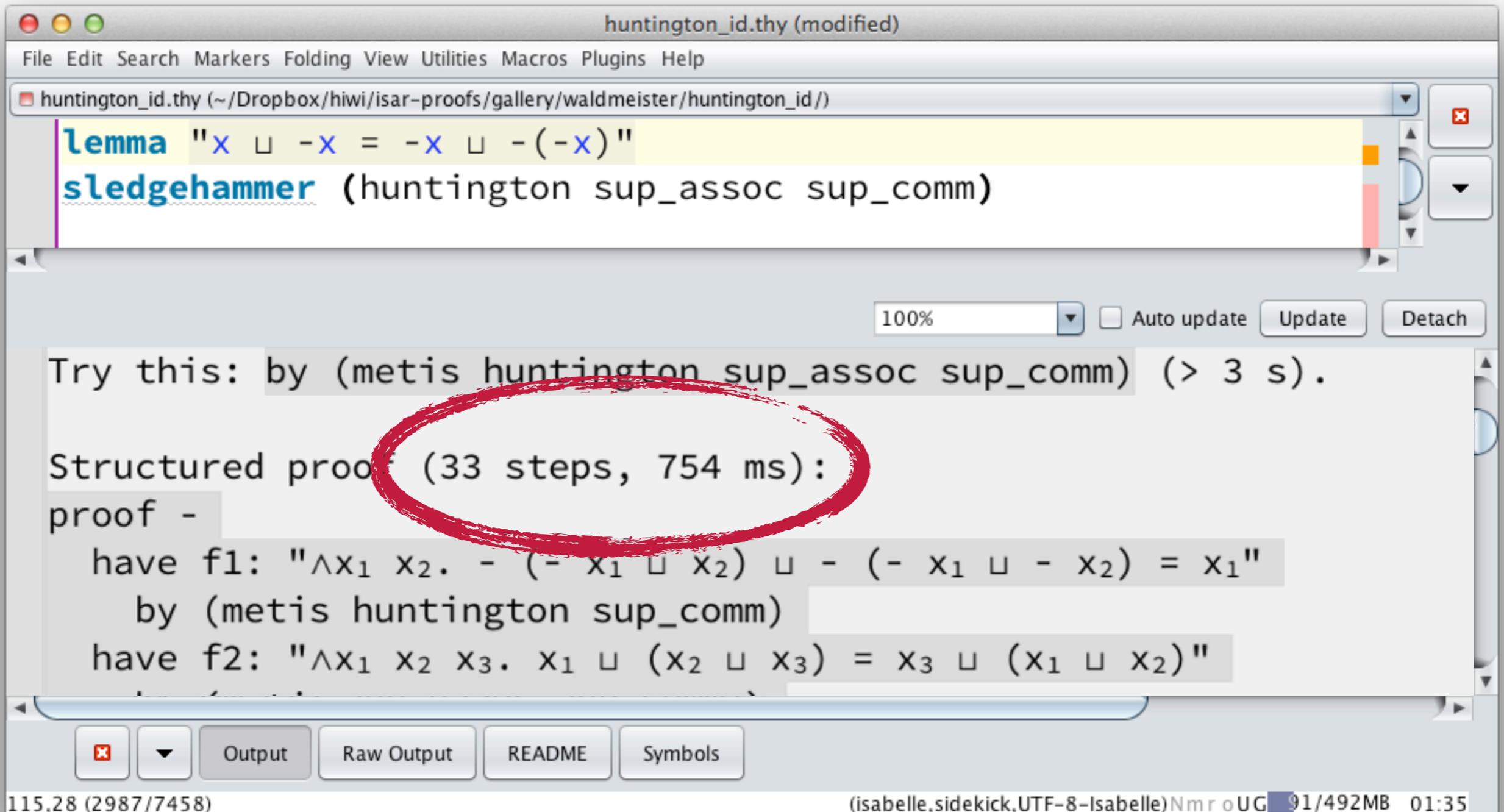
```
huntington_id.thy (modified)
File Edit Search Markers Folding View Utilities Macros Plugins Help
huntington_id.thy (~ /Dropbox/hiwi/isar-proofs/gallery/waldmeister/huntington_id/)
Lemma "x ⊔ -x = -x ⊔ -(-x)"
sledgehammer (huntington sup_assoc sup_comm)

100%  Auto update Update Detach

Try this: by (metis huntington sup_assoc sup_comm) (> 3 s).

Structured proof (43 steps, 1.34 s):
proof -
  have f1: "∧x1 x2. - (- x1 ⊔ x2) ⊔ - (- x1 ⊔ - x2) = x1"
    by (metis huntington sup_comm)
  have f2: "∧x1 x2 x3. x1 ⊔ (x2 ⊔ x3) = x3 ⊔ (x1 ⊔ x2)"
```

# Proof Compression



The screenshot shows a proof editor window titled "huntington\_id.thy (modified)". The window contains a lemma and its structured proof. The lemma is highlighted in yellow and reads: `lemma "x ⊔ -x = -x ⊔ -(-x)"`. Below it, the tactic `sledgehammer` is used with arguments `(huntington sup_assoc sup_comm)`. The proof output shows a structured proof with 33 steps and a duration of 754 ms. The text "Structured proof (33 steps, 754 ms):" is circled in red. The proof steps include: `proof -`, `have f1: "∧x1 x2. - (- x1 ⊔ x2) ⊔ - (- x1 ⊔ - x2) = x1"`, `by (metis huntington sup_comm)`, and `have f2: "∧x1 x2 x3. x1 ⊔ (x2 ⊔ x3) = x3 ⊔ (x1 ⊔ x2)"`. The window also shows a menu bar, a toolbar, and a status bar at the bottom.

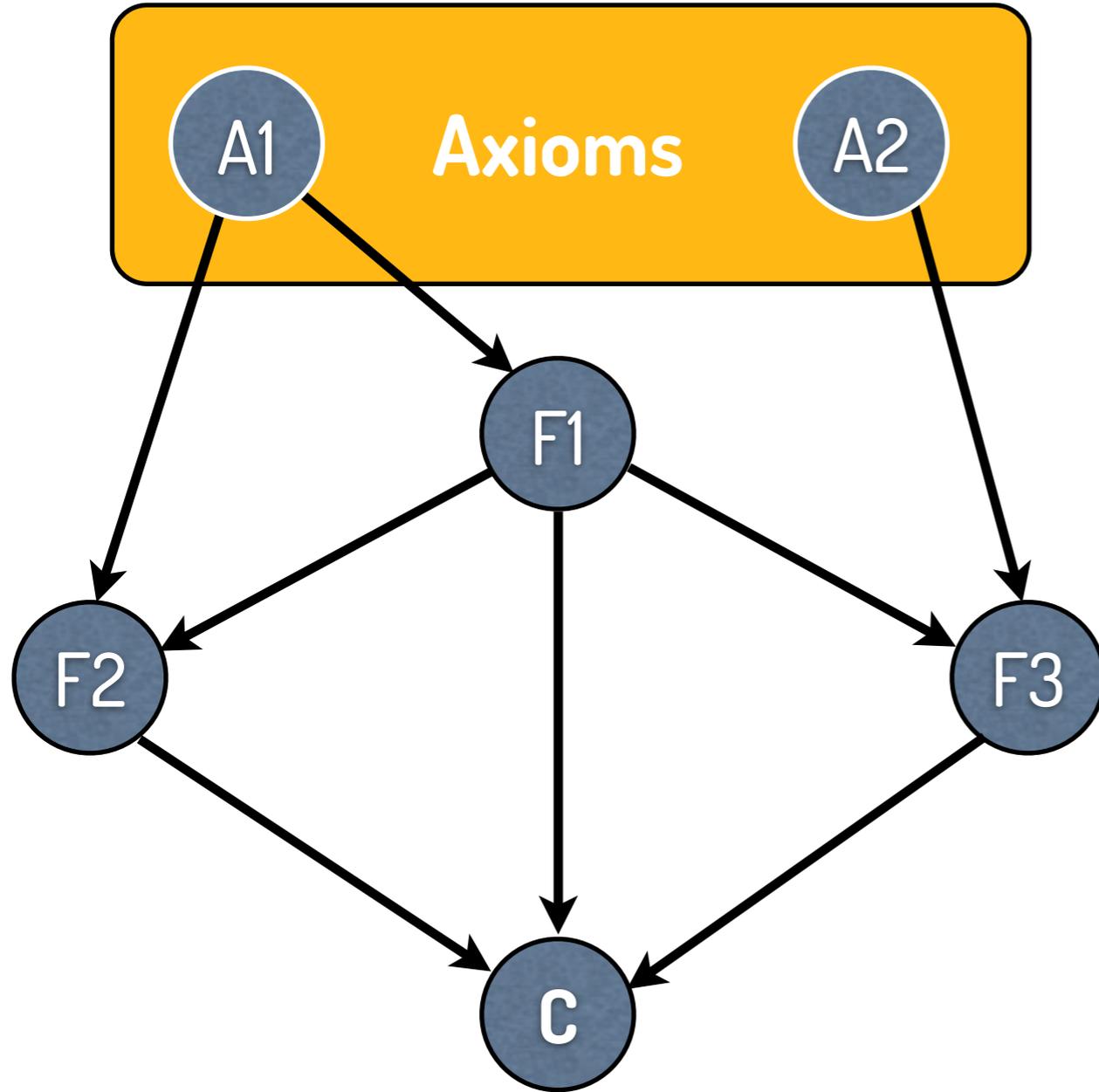
```
File Edit Search Markers Folding View Utilities Macros Plugins Help
huntington_id.thy (~ /Dropbox/hiwi/isar-proofs/gallery/waldmeister/huntington_id/)
lemma "x ⊔ -x = -x ⊔ -(-x)"
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100%  Auto update Update Detach

Try this: by (metis huntington sup_assoc sup_comm) (> 3 s).

Structured proof (33 steps, 754 ms):
proof -
  have f1: "∧x1 x2. - (- x1 ⊔ x2) ⊔ - (- x1 ⊔ - x2) = x1"
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Output Raw Output README Symbols
115,28 (2987/7458) (isabelle,sidekick,UTF-8-Isabelle)Nmr oUG 91/492MB 01:35
```

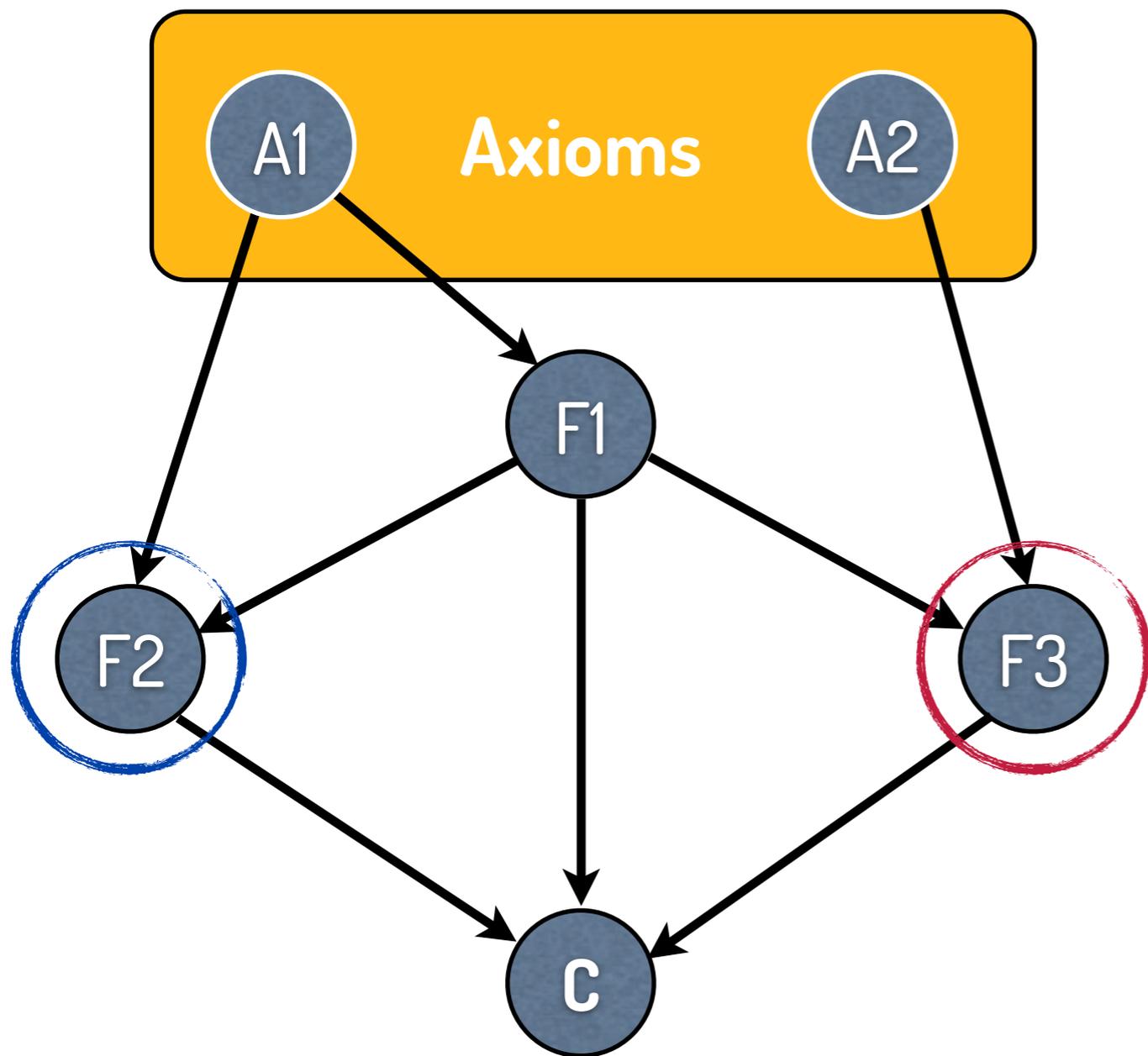


$A1 \vdash F1$

$A1, F1 \vdash F2$

$A2, F1 \vdash F3$

$F1, F2, F3 \vdash C$

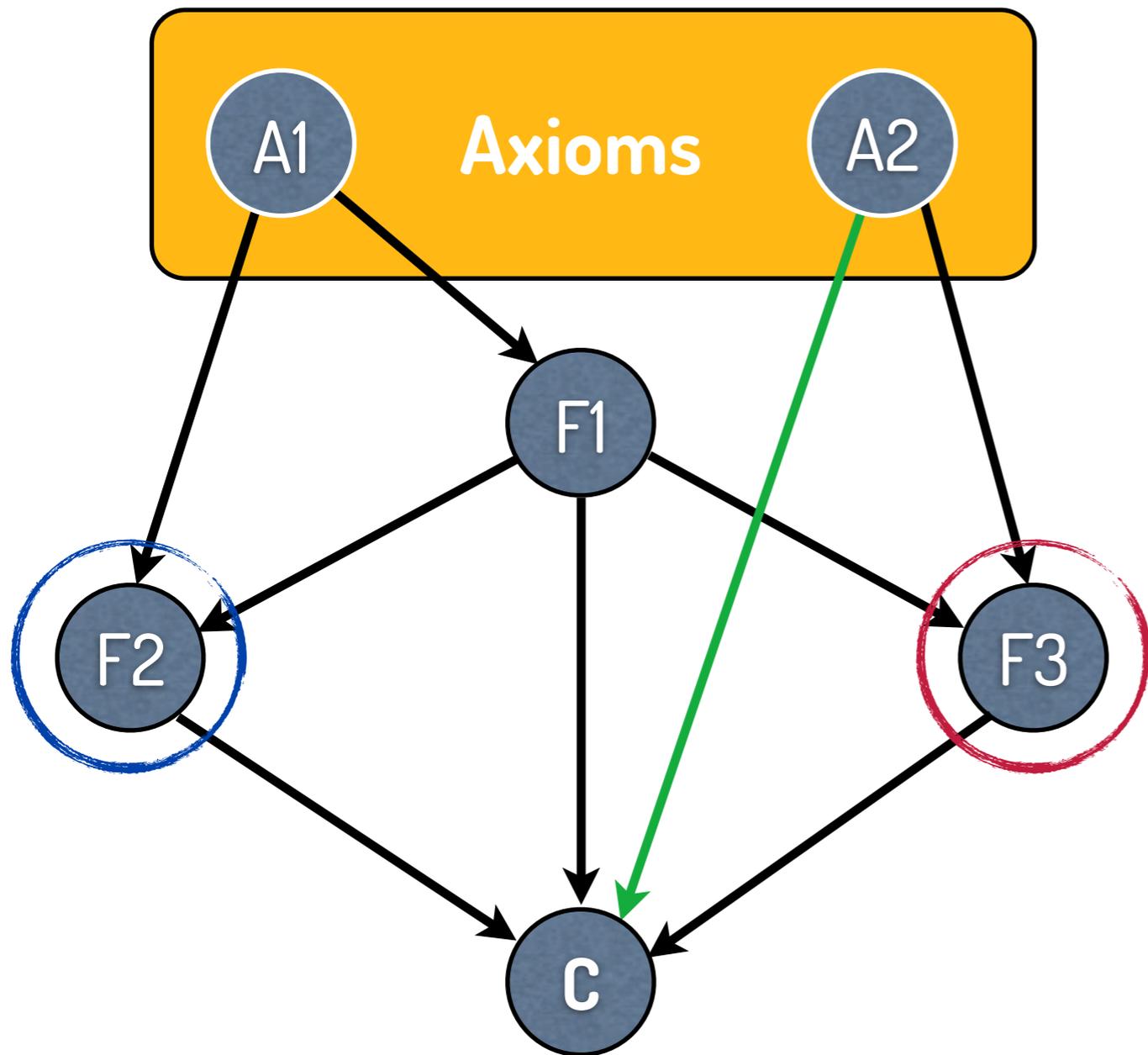


$A1 \vdash F1$

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$A2, F1 \vdash F3$

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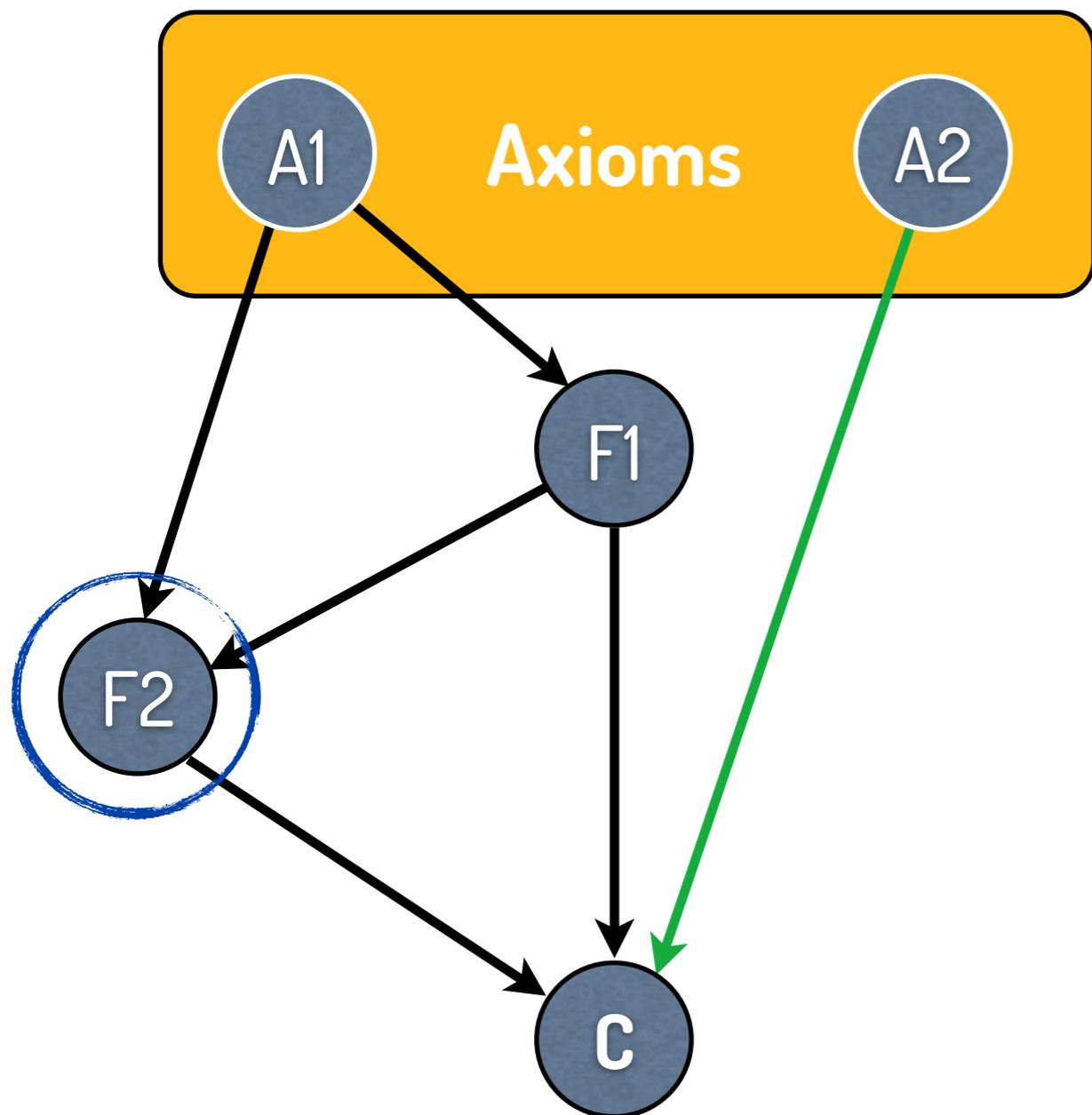


$A1 \vdash F1$

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$A2, F1 \vdash F3$

$F1, F2, F3 \vdash C$



$A1 \vdash F1$

$A1, F1 \vdash F2$

$A2, F1 \vdash F3$

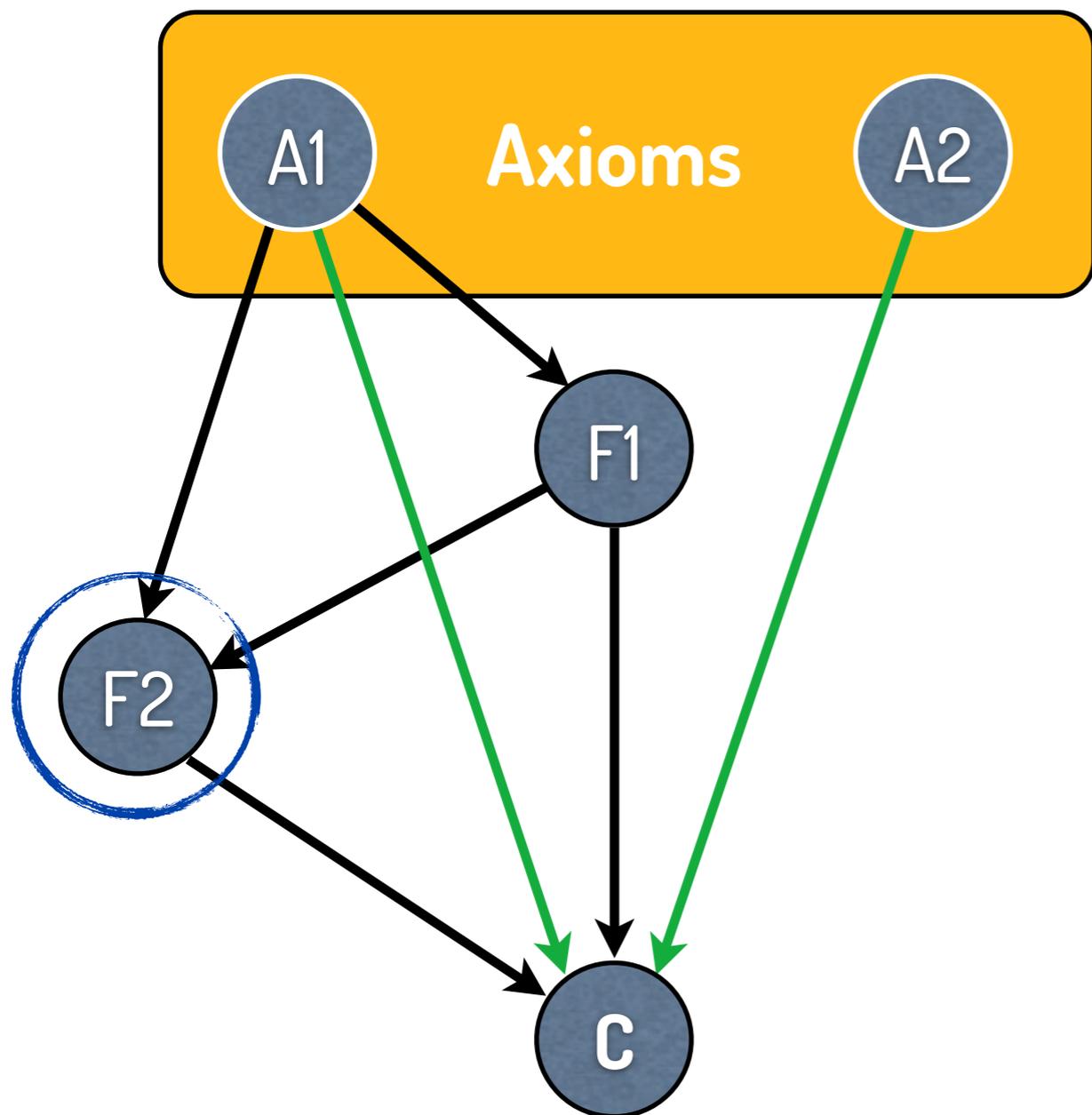
$F1, F2, F3 \vdash C$



$A1 \vdash F1$

$A1, F1 \vdash F2$

$F1, F2, A2 \vdash C$



$A1 \vdash F1$

$A1, F1 \vdash F2$

$A2, F1 \vdash F3$

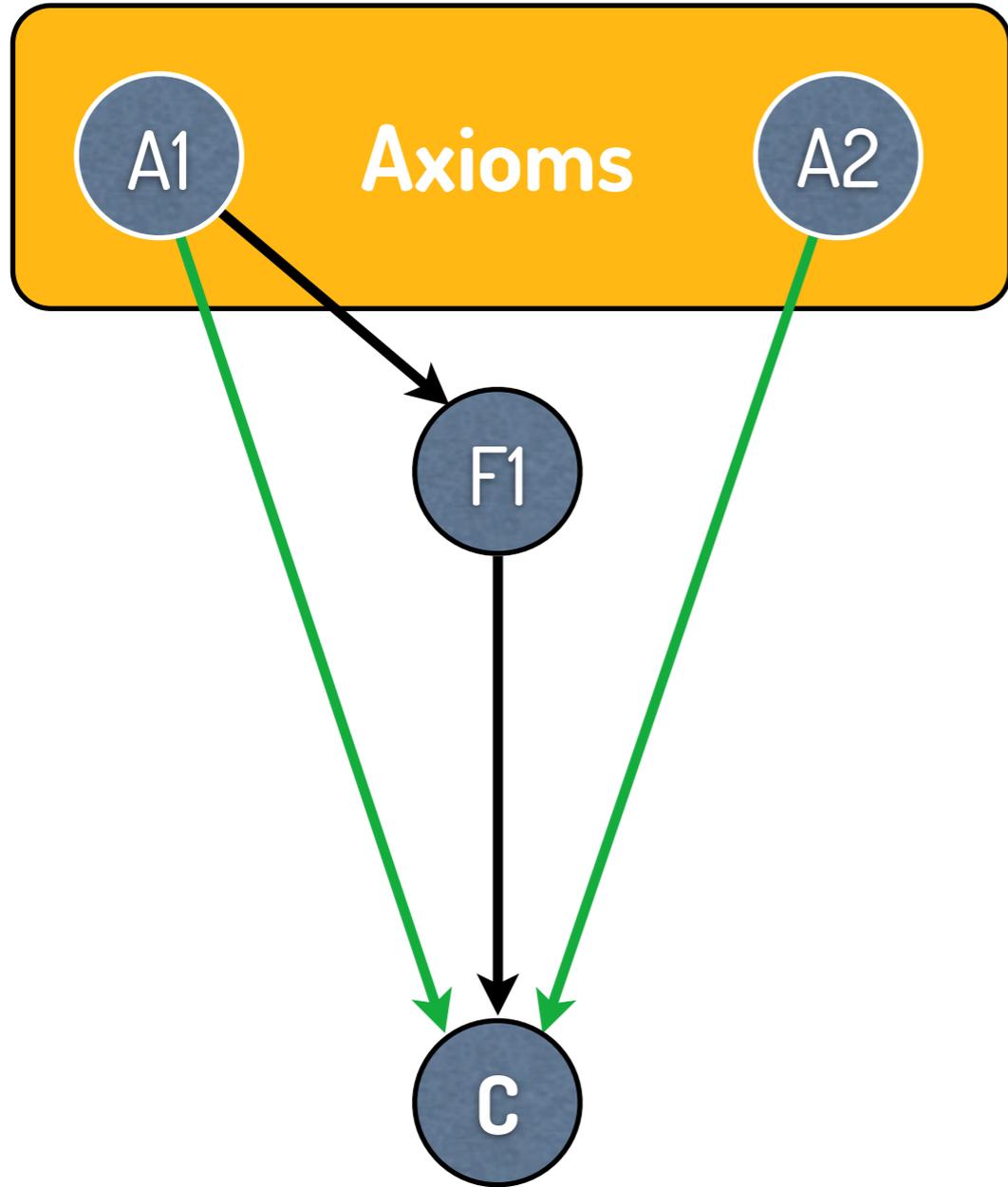
$F1, F2, F3 \vdash C$



$A1 \vdash F1$

$A1, F1 \vdash F2$

$F1, F2, A2 \vdash C$



$A1 \vdash F1$

$A1, F1 \vdash F2$

$A2, F1 \vdash F3$

$F1, F2, F3 \vdash C$



$A1 \vdash F1$

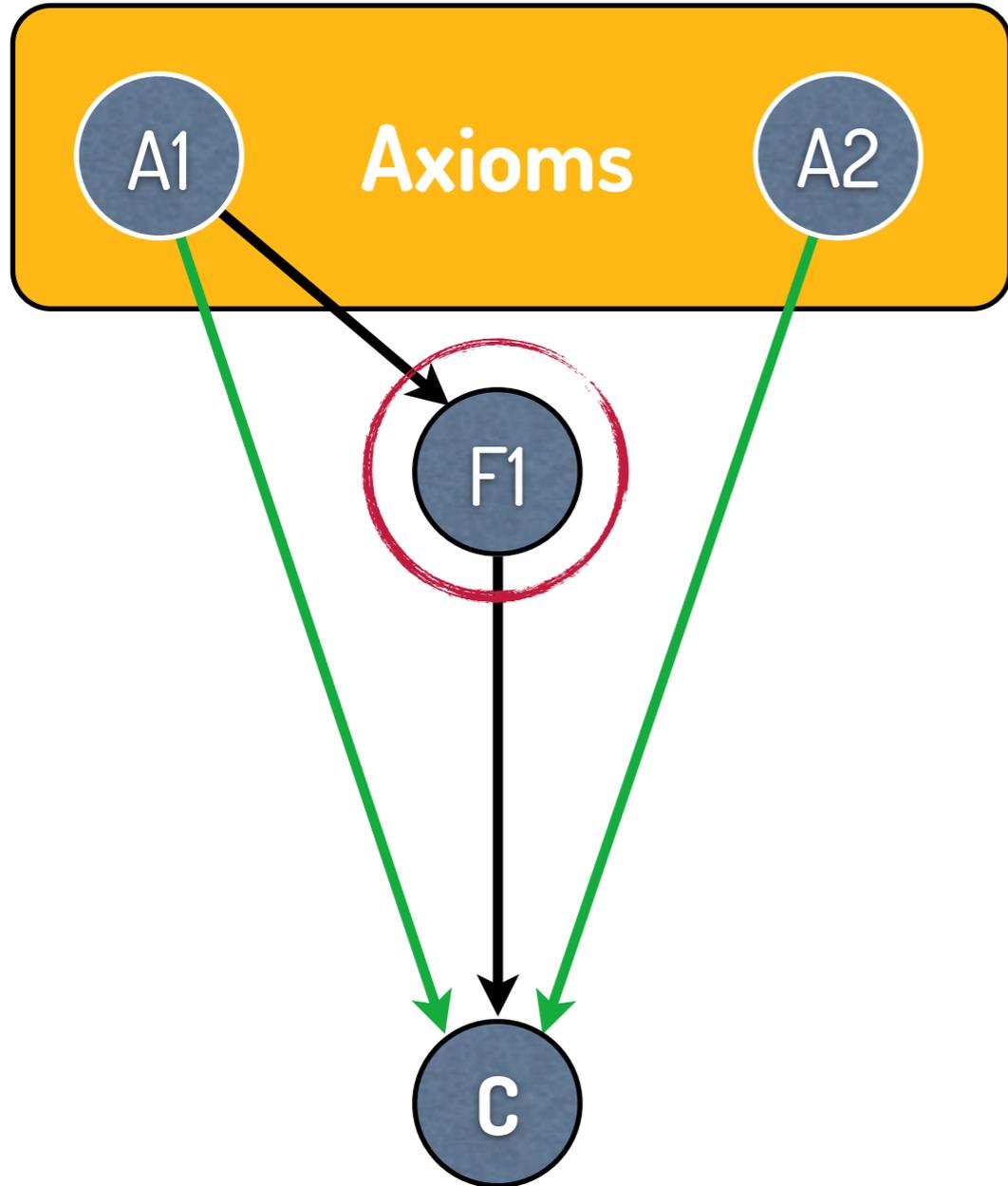
$A1, F1 \vdash F2$

$F1, F2, A2 \vdash C$



$A1 \vdash F1$

$F1, A1, A2 \vdash C$



$A1 \vdash F1$

$A1, F1 \vdash F2$

$A2, F1 \vdash F3$

$F1, F2, F3 \vdash C$



$A1 \vdash F1$

$A1, F1 \vdash F2$

$F1, F2, A2 \vdash C$



$A1 \vdash F1$

$F1, A1, A2 \vdash C$



$$A1, A2 \vdash C$$



$$A1 \vdash F1$$

$$A1, F1 \vdash F2$$

$$A2, F1 \vdash F3$$

$$F1, F2, F3 \vdash C$$



$$A1 \vdash F1$$

$$A1, F1 \vdash F2$$

$$F1, F2, A2 \vdash C$$



$$A1 \vdash F1$$

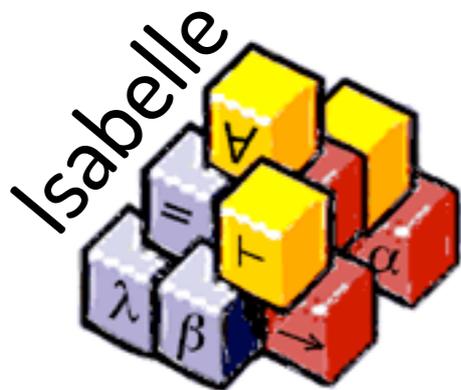
$$F1, A1, A2 \vdash C$$

$$\left. \begin{array}{l} A2, F1 \vdash F3 \\ F1, F2, F3 \vdash P \end{array} \right\} F1, F2, A2 \vdash P$$

Does merger save time? → Preplay

Have we reached a given compression factor?

# Robust, Semi-Intelligible Isabelle Proofs from ATP Proofs



Steffen Juilf Smolka  
Jasmin Christian Blanchette