

# Tutorial: How to Cook a Static Analyzer

## or, The Surprising Effectiveness of Substructural Proof Theory

Peter O'Hearn

Queen Mary, University of London

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# *People*

This is about work by the

**SpaceInvader Team (Ldn)**: Cristiano Calcagno, Dino Distefano, Peter O'Hearn, Hongseok Yang

benefitting from lots of collaboration with our

**SLAyer Colleagues (MSR)**: Josh Berdine, Byron Cook



# *A Substructural Logic*

$$A \not\vdash A * A$$

$$10 \mapsto 3 \not\vdash 10 \mapsto 3 * 10 \mapsto 3$$

$$A * B \not\vdash A$$

$$10 \mapsto 3 * 42 \mapsto 5 \not\vdash 10 \mapsto 3$$

# *Program Verification Extremes*

- ▶ **Extreme 1: Interactive Proof.** HOL, Coq, Isabelle... More human effort, more expressive.
- ▶ **Extreme 2: Static Analysis.** Less expressive, more automatic.
- ▶ And there is population in between (SPARK-Ada, Spec-#...).



# *Program Verification Extremes*

- ▶ **Extreme 1: Interactive Proof.** HOL, Coq, Isabelle... More human effort, more expressive.
  - ▶ *Several embeddings of separation logic in proof assistants.*
- ▶ **Extreme 2: Static Analysis.** Less expressive, more automatic.
  - ▶ *Several prototype program analysis tools: SpaceInvader, SLAyer, THOR, Xisa...*
- ▶ And there is population in between (SPARK-Ada, Spec-#...).
  - ▶ *Smallfoot, SmallfootRG, jStar*



## *Verification by Static Analysis, Current Context*

- ▶ 2000's: impressive practical advances in automatic program verification E.g.
  - ▶ SLAM: Protocol properties of procedure calls in device drivers, e.g.  
any call to `ReleaseSpinLock` is preceded by a call to  
`AquireSpinLock`
  - ▶ ASTRÉE: no run-time errors in Airbus code



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- ▶ The Missing Link
  - ▶ ASTRÉE assumes: no dynamic pointer allocation
  - ▶ SLAM assumes: memory safety
  - ▶ Wither automatic heap verification? (for substantial programs)



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  - ▶ ASTRÉE assumes: no dynamic pointer allocation
  - ▶ SLAM assumes: memory safety
  - ▶ Wither automatic heap verification? (for substantial programs)
- ▶ Many important programs make serious use of heap: Linux, Apache, TCP/IP, IOS... but heap verification is hard.



# Part I

# Symbolic Execution and Verification

# Symbolic Heaps (say less, to do more..)

A special form<sup>1</sup>

$$(B_1 \wedge \dots \wedge B_n) \wedge (H_1 * \dots * H_m)$$

where

$$\begin{aligned} H & ::= E \mapsto \rho \mid \text{tree}(E) \mid \text{lseg}(E, E) \\ B & ::= E = E \mid E \neq E \end{aligned}$$

$$E ::= x \mid \text{nil}$$

$$\rho ::= f_1 : E_1, \dots, f_n : E_n$$

$$B ::= E = E \mid E \neq E$$

---

<sup>1</sup>assertional if-then-else as well

# Verification = Symbolic Execution + Entailment Checking

- ▶ Inductive Definitions unrolled **only** on demand (on heap access) **during execution**.
- ▶ Rolled up **only** after execution, **during entailment checking**
- ▶ The tree definition

$$\text{tree}(E) \iff \begin{aligned} &\text{if } E = \text{nil} \text{ then emp} \\ &\text{else } \exists x, y. (E \mapsto l: x, r: y) * \text{tree}(x) * \text{tree}(y) \end{aligned}$$

# Copytree Verification

Just inside the if (where  $p \neq \text{nil}$ )...

$$\{p \neq \text{nil} \wedge \text{tree}(p)\}$$

$$\begin{aligned} \text{tree}(E) \iff & \text{if } E = \text{nil} \text{ then emp} \\ & \text{else } \exists x, y. (E \mapsto l: x, r: y) * \text{tree}(x) * \text{tree}(y) \end{aligned}$$

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Just inside the if (where  $p \neq \text{nil}$ )...

$$\begin{array}{l} \{p \neq \text{nil} \wedge \text{tree}(p)\} \quad \text{unroll it...} \\ \{p \mapsto [l:x, r:y] * \text{tree}(x) * \text{tree}(y)\} \end{array}$$

$$\begin{aligned} \text{tree}(E) &\iff \text{if } E = \text{nil} \text{ then emp} \\ &\quad \text{else } \exists x, y. (E \mapsto l: x, r: y) * \text{tree}(x) * \text{tree}(y) \end{aligned}$$

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$\{p \mapsto [l:x, r:y] * \text{tree}(x) * \text{tree}(y)\}$

$i := p \rightarrow l ; j := p \rightarrow r;$

$\{p \mapsto [l:i, r:j] * \text{tree}(i) * \text{tree}(j)\}$

$\text{tree}(E) \iff \text{if } E = \text{nil} \text{ then emp}$   
 $\text{else } \exists x, y. (E \mapsto l: x, r: y) * \text{tree}(x) * \text{tree}(y)$

# Copytree Verification

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$\{p \neq \text{nil} \wedge \text{tree}(p)\}$       unroll it...

$\{p \mapsto [l:x, r:y] * \text{tree}(x) * \text{tree}(y)\}$

$i := p \rightarrow l ; j := p \rightarrow r;$

$\{p \mapsto [l:i, r:j] * \text{tree}(i) * \text{tree}(j)\}$

$\text{tree\_copy}(ii ; i) ; \text{tree\_copy}(jj ; j)$

$s := \text{new}(); s \rightarrow l := ii ; s \rightarrow r := jj;$

$\text{tree}(E) \iff \begin{array}{l} \text{if } E = \text{nil} \text{ then emp} \\ \text{else } \exists x, y. (E \mapsto l: x, r: y) * \text{tree}(x) * \text{tree}(y) \end{array}$

# Copytree Verification

Just inside the if (where  $p \neq \text{nil}$ )...

$\{p \neq \text{nil} \wedge \text{tree}(p)\}$       unroll it...

$\{p \mapsto [l: x, r: y] * \text{tree}(x) * \text{tree}(y)\}$

$i := p \rightarrow l; j := p \rightarrow r;$

$\{p \mapsto [l: i, r: j] * \text{tree}(i) * \text{tree}(j)\}$

$\text{tree\_copy}(ii; i); \text{tree\_copy}(jj; j)$

$s := \text{new}(); s \rightarrow l := ii; s \rightarrow r := jj;$

$\{p \mapsto [l: i, r: j] * \text{tree}(i) * \text{tree}(j) * s \mapsto [l: ii, r: jj] * \text{tree}(ii) * \text{tree}(jj)\}$

$\text{tree}(E) \iff \text{if } E = \text{nil} \text{ then emp}$

$\text{else } \exists x, y. (E \mapsto l: x, r: y) * \text{tree}(x) * \text{tree}(y)$

# Copytree Verification

We are left with an entailment

$$\begin{array}{c} p \mapsto [l:i, r:j] * \text{tree}(i) * \text{tree}(j) * s \mapsto [l:ii, r:jj] * \text{tree}(ii) * \text{tree}(jj) \\ \vdash \quad \text{tree}(p) * \text{tree}(s) \end{array}$$

$$\begin{aligned} \text{tree}(E) &\iff \text{if } E = \text{nil} \text{ then emp} \\ &\quad \text{else } \exists x, y. (E \mapsto l: x, r: y) * \text{tree}(x) * \text{tree}(y) \end{aligned}$$

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let me roll it...

$$\begin{aligned} \text{tree}(E) &\iff \text{if } E = \text{nil} \text{ then emp} \\ &\quad \text{else } \exists x, y. (E \mapsto l: x, r: y) * \text{tree}(x) * \text{tree}(y) \end{aligned}$$

# Flawed Copytree Failed Verification

When we mistakenly point back into the source tree

we are left with an entailment

$$\begin{array}{c} p \mapsto [l:i, r:j] * \text{tree}(i) * \text{tree}(j) * s \mapsto [l:i, r:j] * \text{tree}(ii) * \text{tree}(jj) \\ \vdash \quad \text{tree}(p) * \text{tree}(s) \end{array}$$

that we can't roll up...

# Part II

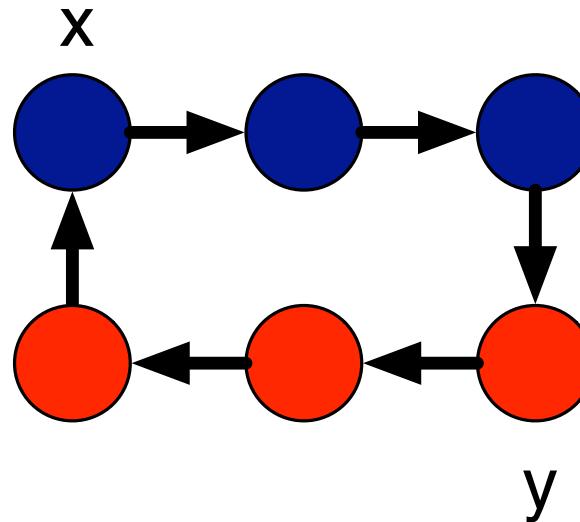
# Proving Entailments

# Induction and Linked Lists

List segments ( $\text{list}(E)$  is shorthand for  $\text{lseg}(E, \text{nil})$ )

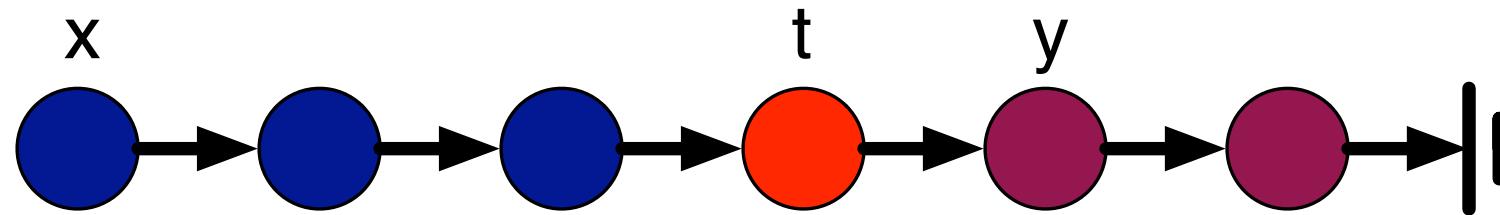
$$\text{lseg}(E, F) \iff \begin{aligned} &\text{if } E = F \text{ then emp} \\ &\text{else } \exists y. E \mapsto tl : y * \text{lseg}(y, F) \end{aligned}$$

$$\text{lseg}(x, y) * \text{lseg}(y, x)$$



# Induction and Linked Lists

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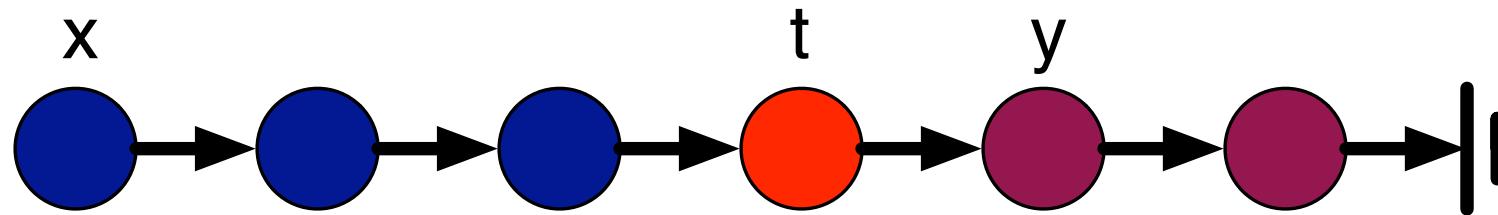
$$\begin{aligned}\text{lseg}(E, F) \iff & \text{ if } E = F \text{ then emp} \\ & \text{else } \exists y. E \mapsto tl : y * \text{lseg}(y, F)\end{aligned}$$
$$\text{lseg}(x, t) * t \mapsto [tl : y] * \text{list}(y)$$


# Induction and Linked Lists

List segments ( $\text{list}(E)$  is shorthand for  $\text{lseg}(E, \text{nil})$ )

$$\begin{aligned}\text{lseg}(E, F) \iff & \text{ if } E = F \text{ then emp} \\ & \text{else } \exists y. E \mapsto tl : y * \text{lseg}(y, F)\end{aligned}$$

Entailment  $\text{lseg}(x, t) * t \mapsto [tl : y] * \text{list}(y) \vdash \text{list}(x)$

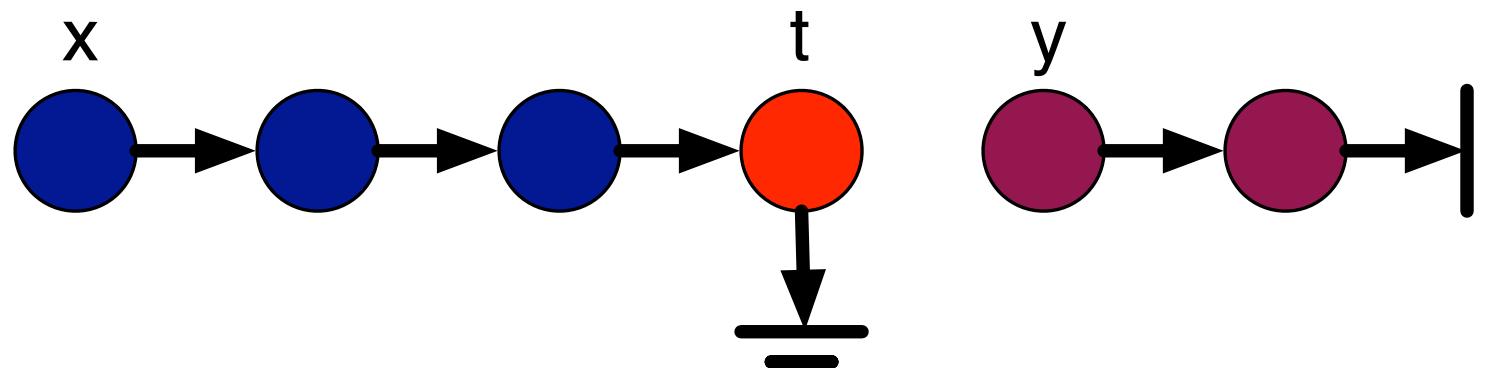


# Induction and Linked Lists

List segments ( $\text{list}(E)$  is shorthand for  $\text{lseg}(E, \text{nil})$ )

$$\begin{aligned}\text{lseg}(E, F) \iff & \text{ if } E = F \text{ then emp} \\ & \text{else } \exists y. E \mapsto t / :y * \text{lseg}(y, F)\end{aligned}$$

Non-Entailment  $\text{lseg}(x, t) * t \mapsto \text{nil} * \text{list}(y) \not\vdash \text{list}(x)$



# Solution (Berdine and Calcagno)

- ▶ A proof theory oriented around **Abstraction** and **Subtraction**.

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$$\text{!seg}(x, t) * \text{list}(t) \vdash \text{list}(x)$$

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- ▶ A proof theory oriented around **Abstraction** and **Subtraction**.
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$$\text{!seg}(x, t) * \text{list}(t) \vdash \text{list}(x)$$

- ▶ Subtraction Rule

$$\frac{Q_1 \vdash Q_2}{Q_1 * S \vdash Q_2 * S}$$

# Solution (Berdine and Calcagno)

- ▶ A proof theory oriented around **Abstraction** and **Subtraction**.
- ▶ Sample Abstraction Rule

$$\text{lseg}(x, t) * \text{list}(t) \vdash \text{list}(x)$$

- ▶ Subtraction Rule

$$\frac{Q_1 \vdash Q_2}{Q_1 * S \vdash Q_2 * S}$$

- ▶ Try to reduce an entailment to the axiom

---

$$B \wedge \text{emp} \vdash \text{true} \wedge \text{emp}$$

# Works great!

$$\text{!seg}(x, t) * \textcolor{red}{t \mapsto [tl : y]} * \text{list}(y) \vdash \text{list}(x)$$

Abstract (Roll)

# Works great!

$$\text{lseg}(x, t) * \text{list}(t) \vdash \text{list}(x)$$
$$\text{lseg}(x, t) * t \mapsto [tl : y] * \text{list}(y) \vdash \text{list}(x)$$

Abstract (Inductive)

Abstract (Roll)

# Works great!

$$\text{list}(x) \vdash \text{list}(x)$$
$$\text{lseg}(x, t) * \text{list}(t) \vdash \text{list}(x)$$
$$\text{lseg}(x, t) * t \mapsto [tl : y] * \text{list}(y) \vdash \text{list}(x)$$

Subtract

Abstract (Inductive)

Abstract (Roll)

# Works great!

:-)

$\text{emp} \vdash \text{emp}$

Axiom!

$\text{list}(x) \vdash \text{list}(x)$

Subtract

$\text{Iseg}(x, t) * \text{list}(t) \vdash \text{list}(x)$

Abstract (Inductive)

$\text{Iseg}(x, t) * t \mapsto [tl : y] * \text{list}(y) \vdash \text{list}(x)$

Abstract (Roll)

# Works great!

:-)

$\text{emp} \vdash \text{emp}$

Axiom!

$\text{list}(x) \vdash \text{list}(x)$

Subtract

$\text{!seg}(x, t) * \text{list}(t) \vdash \text{list}(x)$

Abstract (Inductive)

$\text{!seg}(x, t) * t \mapsto [t / : y] * \text{list}(y) \vdash \text{list}(x)$

Abstract (Roll)

$\text{!seg}(x, t) * t \mapsto \text{nil} * \text{list}(y) \vdash \text{list}(x)$

Abstract (Inductive)

# Works great!

:-)

$\text{emp} \vdash \text{emp}$

Axiom!

$\text{list}(x) \vdash \text{list}(x)$

Subtract

$\text{lseg}(x, t) * \text{list}(t) \vdash \text{list}(x)$

Abstract (Inductive)

$\text{lseg}(x, t) * t \mapsto [tl : y] * \text{list}(y) \vdash \text{list}(x)$

Abstract (Roll)

$\text{list}(x) * \text{list}(y) \vdash \text{list}(x)$

Subtract

$\text{lseg}(x, t) * t \mapsto \text{nil} * \text{list}(y) \vdash \text{list}(x)$

Abstract (Inductive)

# Works great!

..

$\text{emp} \vdash \text{emp}$

Axiom!

$\text{list}(x) \vdash \text{list}(x)$

Subtract

$\text{lseg}(x, t) * \text{list}(t) \vdash \text{list}(x)$

Abstract (Inductive)

$\text{lseg}(x, t) * t \mapsto [tl : y] * \text{list}(y) \vdash \text{list}(x)$

Abstract (Roll)

..

$\text{list}(y) \vdash \text{emp}$

Junk: Not Axiom!

$\text{list}(x) * \text{list}(y) \vdash \text{list}(x)$

Subtract

$\text{lseg}(x, t) * t \mapsto \text{nil} * \text{list}(y) \vdash \text{list}(x)$

Abstract (Inductive)

# List of abstraction rules for lseg

## Rolling

$$\text{emp} \rightarrow \text{lseg}(E, E)$$

$$E_1 \neq E_3 \wedge E_1 \mapsto [t / : E_2, \rho] * \text{lseg}(E_2, E_3) \rightarrow \text{lseg}(E_1, E_3)$$

## Induction Avoidance

$$\text{lseg}(E_1, E_2) * \text{lseg}(E_2, \text{nil}) \rightarrow \text{lseg}(E_1, \text{nil})$$

$$\text{lseg}(E_1, E_2) * E_2 \mapsto [t : \text{nil}] \rightarrow \text{lseg}(E_1, \text{nil})$$

$$\text{lseg}(E_1, E_2) * \text{lseg}(E_2, E_3) * E_3 \mapsto [\rho] \rightarrow \text{lseg}(E_1, E_3) * E_3 \mapsto [\rho]$$

$$\begin{aligned} E_3 \neq E_4 \wedge \text{lseg}(E_1, E_2) * \text{lseg}(E_2, E_3) * \text{lseg}(E_3, E_4) \\ \rightarrow \text{lseg}(E_1, E_3) * \text{lseg}(E_3, E_4) \end{aligned}$$

# Proof Procedure for $Q_1 \vdash Q_2$ , Normalization Phase

- ▶ Substitute out all equalities

$$\frac{Q_1[E/x] \vdash Q_2[E/x]}{x = E \wedge Q_1 \vdash Q_2}$$

- ▶ Generate disequalities. E.g., using

$$x \mapsto [\rho] * y \mapsto [\rho'] \rightarrow x \neq y$$

- ▶ Remove empty lists and trees:  $\text{lseg}(x, x)$ ,  $\text{tree}(\text{nil})$
- ▶ Check antecedent for inconsistency, if so, return “valid”.  
Inconsistencies:  
 $x \mapsto [\rho] * x \mapsto [\rho']$      $\text{nil} \mapsto -$      $x \neq x$      $\dots$
- ▶ Check pure consequences (easy inequational logic), if failed then “invalid”

# Proof Procedure for $Q_1 \vdash Q_2$ , Abstract/Subtract Phase

Trying to prove  $B_1 \wedge H_1 \vdash H_2$

- ▶ For each spatial predicate in  $H_2$ , try to apply abstraction rules to match it with things in  $H_1$ .
- ▶ Then, apply subtraction rule.

$$\frac{Q_1 \vdash Q_2}{Q_1 * S \vdash Q_2 * S}$$

- ▶ If you are left with

$$B \wedge \text{emp} \vdash \text{true} \wedge \text{emp}$$

report “valid”, else “invalid”

# Completeness

- ▶ Proof procedure is complete (and quadratic) when we know all the listsegs are nonempty (when  $x \neq y$  is there for each  $\text{Iseg}(x, y)$ ).

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- ▶ Complete procedure for general case, using excluded middle

$$\frac{x = y \wedge Q_1 \vdash Q_2 \quad x \neq y \wedge Q_1 \vdash Q_2}{Q_1 \vdash Q_2}$$

# Completeness

- ▶ Proof procedure is complete (and quadratic) when we know all the listsegs are nonempty (when  $x \neq y$  is there for each  $\text{Iseg}(x, y)$ ).
- ▶ Complete procedure for general case, using excluded middle

$$\frac{x = y \wedge Q_1 \vdash Q_2 \quad x \neq y \wedge Q_1 \vdash Q_2}{Q_1 \vdash Q_2}$$

- ▶ The resulting proof procedure is exponential. Never implemented.

# Part III

# Automatically Inferring Frame Axioms

## *A Small Spec, and a Small Proof*

- ▶ Spec  
[tree( $p$ )] DispTree( $p$ ) [emp]
- ▶ Proof of body of recursive procedure

[tree( $i$ )\*tree( $j$ )]

DispTree( $i$ );

[emp \* tree( $j$ )]

DispTree( $j$ );

[emp]

$$\frac{\{P\} C \{Q\}}{\{P*R\} C \{Q*R\}} \text{ Frame Rule}$$

## *A Small Spec, and a Small Proof*

- ▶ Spec  
[tree( $p$ )] DispTree( $p$ ) [emp]
- ▶ Proof of body of recursive procedure

```
[tree( $i$ )*tree( $j$ )]  
DispTree( $i$ );  
[emp * tree( $j$ )]  
DispTree( $j$ );  
[emp]
```

To automate  
we must infer frames  
during ``execution''

$$\frac{\{P\} C \{Q\}}{\{P*R\} C \{Q*R\}} \text{ Frame Rule}$$

# Frame Inference: An Extension to the Entailment Question

$$A \vdash B$$

# Frame Inference: An Extension to the Entailment Question

$$A \vdash B * ?$$

# Frame Inference: An Extension to the Entailment Question

$$\text{tree}(i) * \text{tree}(j) \vdash \text{tree}(i) * ?$$

# Frame Inference: An Extension to the Entailment Question

$\text{tree}(i) * \text{tree}(j) \vdash \text{tree}(i) * \text{tree}(j)$

# Frame Inference: An Extension to the Entailment Question

$$x \neq \text{nil} \wedge \text{list}(x) \vdash \exists x'. x \mapsto x' * ?$$

# Frame Inference: An Extension to the Entailment Question

$$x \neq \text{nil} \wedge \text{list}(x) \vdash \exists x'. x \mapsto x' * \text{list}(x')$$

# Frame Inference: An Extension to the Entailment Question

$$A \vdash B * ?$$

# How to infer a frame

Convert a failed derivation

$\text{list}(y) \vdash \text{emp}$

Junk: Not Axiom!

$\text{list}(x) * \text{list}(y) \vdash \text{list}(x)$

Subtract

$\text{lseg}(x, t) * t \mapsto \text{nil} * \text{list}(y) \vdash \text{list}(x)$

Abstract (Inductive)

into a successful one

$\text{emp} \vdash \text{emp}$

Axiom

$\text{list}(y) \vdash \text{list}(y)$

Subtract

$\text{list}(x) * \text{list}(y) \vdash \text{list}(x) * \text{list}(y)$

Subtract

$\text{lseg}(x, t) * t \mapsto \text{nil} * \text{list}(y) \vdash \text{list}(x) * \text{list}(y)$

Abstract (Inductive)

# How to infer a frame, more generally

- ▶ Problem:  $A \vdash B*$ ?
- ▶ Apply abstraction and subtraction to shrink your goal:  
if you get to  $F \vdash \text{emp}$  then  $F$  is your frame axiom.

$$\begin{array}{ccc} F \vdash \text{emp} & & \uparrow \\ \vdots & & \uparrow \\ A \vdash B & & \uparrow \end{array}$$

- ▶ Sometimes you need to deal with multiple leaves at top (case analysis)

# Part IV

# Abstract Interpretation

## *Cooking a Program Analyzer*

1. Just write an interpreter. (Well, an *abstract* interpreter.)
2. Symbolically execute statements using in-place reasoning (all true Hoare triples).
3. Interpret while loops by using abstractin rules like

$$\text{ls}(x, t') * \text{list}(t') \vdash \text{list}(x)$$

to automatically find loop invariants. This uses the rule of consequence on the right to find the invariant for the while rule

$$\frac{\{P\} C \{Q\} \quad Q \vdash Q'}{\{P\} C \{Q'\}} \qquad \frac{\{I \wedge B\} C \{I\}}{\{I\}_{\text{while } B \text{ do }} \{I \wedge \neg B\}}$$

4. A terminating run of the interpreter will give us a **proof** of assertions at all program points.

## *Example*

```
{emp}
x=nil;
while (_){
    new(y);
    y->tl = x;
    x=y;
}
```

Calculated Loop Invariant

∨

∨

## *Example*

```
{emp}
x=nil;
while (_ ){
    x = nil  $\wedge$  emp
    new(y);
    y -> tl = x;
    x=y;
}
```

Calculated Loop Invariant

$x = \text{nil} \wedge \text{emp}$

$\vee$

$\vee$

## *Example*

```
{emp}
x=nil;
while (_){
    x ↪ nil
    new(y);
    y -> tl = x;
    x=y;
}
```

Calculated Loop Invariant

$$\begin{aligned} & x = \text{nil} \wedge \text{emp} \\ \vee \quad & x \mapsto \text{nil} \\ \vee \quad & \end{aligned}$$

## *Example*

```
{emp}
x=nil;
while (_ ){
    x  $\mapsto$  x' * x'  $\mapsto$  nil
    new(y);
    y  $\rightarrow t l = x;$ 
    x=y;
}
```

Calculated Loop Invariant

$$\begin{aligned} & x = \text{nil} \wedge \text{emp} \\ \vee \quad & x \mapsto \text{nil} \\ \vee \quad & \end{aligned}$$

## *Example*

```
{emp}
x=nil;
while (_){
    ls(x,nil)
    new(y);
    y->tl = x;
    x=y;
}
```

Calculated Loop Invariant

$$\begin{aligned} & x = \text{nil} \wedge \text{emp} \\ \vee & \quad x \mapsto \text{nil} \\ \vee & \quad \text{ls}(x, \text{nil}) \end{aligned}$$

## *Example*

```
{emp}
x=nil;
while (_){
    x  $\mapsto$  x' * ls(x', nil)
    new(y);
    y  $\rightarrow t l = x;$ 
    x=y;
}
```

### Calculated Loop Invariant

$$\begin{aligned} & x = \text{nil} \wedge \text{emp} \\ \vee & \quad x \mapsto \text{nil} \\ \vee & \quad \text{ls}(x, \text{nil}) \end{aligned}$$

## *Example*

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{emp}
x=nil;
while (_){
    ls(x,nil)
    new(y);
    y->tl = x;
    x=y;
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Fixed-point reached!

# Perspective: this seemingly exotic logic has pretty effective proof technology

- ▶ Can mix with other provers. Apply subtraction rule to simplify formulae as a tactic, or make call-outs other proof procedures as you go.
  - ▶ **Parkinson's talk later today:** *call-out to Z3 SMT solver;*
  - ▶ **Shao's talk later:** *proof theory inside Coq tactics.*
  - ▶ **Tuerk's poster and paper in proceedings:** *HOLfoot.*
  - ▶ And other tools (*Tokyo, Sydney, Singapore*) use *Omega*, *Isabelle*...
- ▶ **Frame inference** can be used to modularize a program analysis or (I imagine) to increase automation in an interactive proof.
- ▶ The induction-avoiding **abstraction rules**, like

$$\text{Iseg}(x, t) * \text{list}(t) \vdash \text{list}(x)$$

can also be used to infer loop invariants (abstract interpretation) by helping us reach fixed-points.

*See talks of **Parkinson**, **Gotsman**, **Magill**,  
**Distefano** later today for more on analysis.*