# Variance Analyses from Invariance Analyses 

Josh Berdine<br>jjb@microsoft.com<br>Microsoft Research, Cambridge

Joint work with Aziem Chawdhary, Byron Cook, Dino Distefano \& Peter O'Hearn

SAVCBS'06: 10 Nov 2006
$\rightarrow$ Safety properties \& reachability:

- For proving that software doesn't "crash"
- Many verification tools \& techniques at hand
- Software model checkers, e.g. SLAM, Blast, SATAbs,...
- Abstract domains: e.g. Interval, Octagon, Polyhedra,...
- Other static analyzers: e.g. various control-flow, shape,... analyses
- Not insignificant degree of coverage and maturity
$\rightarrow$ Liveness \& termination:
- For proving that software does "react"
- Fewer verification tools
- Often not as general, each strongly tailored to a form of programs
- Sometimes "inconvenient" restrictions: e.g. no nested loops, purely functional
$\rightarrow$ Here: constructing termination provers from safety analyzers


## Termination provers for free!

$\rightarrow$ Take an invariance analysis as a parameter

- Computes an invariance assertion for each program location
- An invariance assertion for $\ell$ holds of all reachable states at $\ell$
$\rightarrow$ Construct its induced variance analysis
- Computes a variance assertion for each program location
- A variance assertion for $\ell$ holds between any reachable state at $\ell$ and any previous state at $l$
$\rightarrow$ Yields a termination prover
- We give a local termination predicate $\mathcal{L I}$ such that
- Program terminates if $\mathcal{L} \mathcal{T}$ holds of each program location's variance assertion
$\rightarrow$ Need two additional operations on abstract representation
- Seed \& WellFounded
- Not difficult to define in practice
$\rightarrow$ Introduction
$\rightarrow$ Overview induced variance analysis algorithm
$\rightarrow$ Local termination predicates
$\rightarrow$ Play-by-play for an example
$\rightarrow$ Requirements on instantiations
$\rightarrow$ Instantiation for numerical abstract domains
$\rightarrow$ Instantiation for shape analysis
$\rightarrow$ Conclusion


## Parameterized variance analysis algorithm

01 VarianceAnalysis $\left(P, L, I^{\sharp}\right)$ \{
$02 \quad I A s:=\operatorname{InvarianceAnalysis}\left(P, I^{\sharp}\right)$
03 foreach $\ell \in L\{$
$04 \quad$ LTPreds $[\ell]:=$ true
$05 \quad O:=\operatorname{Isolate}(P, L, \ell)$
06 foreach $q \in I A s$ such that $\mathrm{pc}(q)=\ell\{$

07
08
09
10
11
12
13
14
15 return LTPreds
16 \}
\}
\}
\}
\}
$V A s:=\operatorname{InvarianceAnalysis}(O, \operatorname{Step}(O,\{\operatorname{Seed}(q)\}))$ foreach $r \in V A s\{$
if $\mathrm{pc}(r)=\ell \wedge \neg \mathrm{WELLFOUNDED}(r)\{$ LTPreds $[\ell]:=$ false

## Parameterized variance analysis algorithm

01 VarianceAnalysis $\left(P, L, I^{\sharp}\right)\{$

## Underlying invariance analysis

$02 \quad I A s:=$ InvarianceAnalysis $\left(\overline{\left.P, I^{+}\right)}\right.$
03 foreach $\ell \in L\{$

04
05
06
07
08
09
10
11
12
13
14
LTPreds $[\ell]:=$ true $O:=\operatorname{Isolate}(P, L, \ell)$
foreach $q \in I A s$ such that $\mathrm{pc}(q)=\ell\{$
$V A s:=\operatorname{InvarianceAnalysis}(O, \operatorname{Step}(O,\{\operatorname{SeEd}(q)\}))$ foreach $r \in V A s\{$
if $\mathrm{pc}(r)=\ell \wedge \neg \operatorname{WELLFOUNDED}(r)\{$ LTPreds $[\ell]:=$ fal

\}
\}
15 return LTPreds
16 \}

Additional operation to check progress is being made

Single-step version of invariance analysis

Additional operation to plant initial representation of progress

## Parameterized variance analysis algorithm


$06 \quad$ foreach $q \in I A s$ such that $\mathrm{pc}(q)=\ell\{$
$07 \quad V A s:=\operatorname{InvarianceAnalysis}(O, \operatorname{Step}(O,\{\operatorname{SeEd}(q)\}))$

08
09
10
11
12
13
14
15 return LTPreds 16 \}
\}
\}
\}
foreach $r \in V A s$ \{
if $\mathrm{pc}(r)=\ell \wedge \neg \operatorname{WELLFOUNDED}(r)\{$ LTPreds $[\ell]:=$ false
 which local termination predicates were proved

## Local termination predicates

```
82 while (x>a && y>b) {
83 if (nondet()) {
84
85
86
87
88
89
90 }
```

$\rightarrow$ Line 83 is not visited infinitely often
$\rightarrow$ Line 85 is not visited infinitely often
$\rightarrow$ Program terminates

## Local termination predicates


$\rightarrow$ Line 83 is visited infinitely often
$\rightarrow$ Program diverges
but...
$\rightarrow \mathcal{L \mathcal { T }}$ (83): Line 83 is visited infinitely often only when the program's execution exits the loop contained in lines 82 to 90 infinitely often

## Local termination predicates

```
8 1 \text { while (nondet()) \{}
82 while (x>a && y>b) {
83 if (nondet()) {
84 do {
85 x = x - 1;
86 } while (nondet());
87 } else {
88 y = y - 1;
89 }
90 }
91 }
```

$\rightarrow$ Line 85 is visited infinitely often
$\rightarrow$ Program diverges
but still...
$\rightarrow \mathcal{L} \mathcal{T}(83)$ : Line 83 is visited infinitely often only when the program's execution exits the loop contained in lines 82 to 90 infinitely often

## Local termination predicates

$\rightarrow \mathcal{L} \mathcal{T}(82)$ : Line 82 is visited infinitely often only when the program's execution exits the loop contained in lines 81 to 91 infinitely often $\times$
$\rightarrow \mathcal{L} \mathcal{T}(83)$ : Line 83 is visited infinitely often only when the program's execution exits the loop contained in lines 82 to 90 infinitely often
$\rightarrow \mathcal{L} \mathcal{T}(85)$ : Line 85 is visited infinitely often only when the program's execution exits the loop contained in lines 84 to 86 infinitely often $\times$

## Illustrative example

$\rightarrow$ Consider an invariance analysis based on the Octagon domain
$\rightarrow$ Can express conjunctions of inequalities of the form: $\pm x+ \pm y \leq c$
$\rightarrow$ Represent the program counter with equalities: $\mathrm{pc}=\mathrm{c}$


## Illustrative example

$\longrightarrow 01 \operatorname{VarianceAnalysis}\left(P, L, I^{\sharp}\right)\{$
$02 \quad I A s:=\operatorname{InvarianceAnalysis}\left(P, I^{\sharp}\right)$
03 foreach $\ell \in L\{$
$04 \quad$ LTPreds $[\ell]:=$ true
$05 \quad O:=\operatorname{Isolate}(P, L, \ell)$
06
07
08
09
10
11
12
13
14
16 \}
foreach $q \in I A s$ such that $\mathrm{pc}(q)=\ell\{$
$V A s:=\operatorname{InvarianceAnalysis}(O, \operatorname{Step}(O,\{\operatorname{SeED}(q)\}))$
foreach $r \in V A s\{$
if $\mathrm{pc}(r)=\ell \wedge \neg \operatorname{WELLFOUNDED}(r)\{$
LTPreds $[\ell]:=$ false


## Illustrative example

```
\(01 \operatorname{VarianceAnalysis}\left(P, L, I^{\sharp}\right)\)
\(p c=81 \wedge x \geq a+1 \wedge y \geq b+1\)
```

$02 \quad I A s:=\operatorname{InvaRIANCEANALYSIS}\left(P, I^{\sharp}\right)$
03 foreach $\ell \in L\{$
$04 \quad$ LTPreds $[\ell]:=$ true
$05 \quad O:=\operatorname{IsOLATE}(P, L, \ell)$
foreach $\ell \in L$ \{
LTPreds $[\ell]:=$ true
$O:=\operatorname{Isolate}(P, L, \ell)$
foreach $q \in I A s$ such that $\mathrm{pc}(q)=\ell\{$
$V A s:=\operatorname{InvarianceAnalysis}(O, \operatorname{Step}(O,\{\operatorname{SeED}(q)\}))$
foreach $r \in V A s\{$
if $\mathrm{pc}(r)=\ell \wedge \neg \operatorname{WELLFOUNDED}(r)\{$
LTPreds $[\ell]:=$ false


## Illustrative example

$01 \operatorname{VarianceAnalysis}\left(P, L, I^{\sharp}\right)\{\quad \mathrm{pc}=81 \wedge \mathrm{x} \geq \mathrm{a}+1 \wedge \mathrm{y} \geq \mathrm{b}+1$
$02 \quad I A s:=\operatorname{InvarianceAnalysis}\left(P, I^{\sharp}\right)$
03 foreach $\ell \in L\{$

04
05
$O$ LTPreds $[\ell]:=$ true

IsoLATE $(P, L, \ell)$

06
07
08
09
10
11
12
$13 \quad\}$

$$
\}
$$

$14\}$
15 return LTPreds
$16\}$

$$
\}
$$

$$
\}
$$

$$
p c=83 \wedge x \geq a+1 \wedge y \geq b+1
$$

$$
\{s \mid s(p c)=83 \wedge
$$

$V A s:=$ Invarianceanal

$$
s(x) \geq s(a)+1 \wedge s(y) \geq s(b)+1\}
$$ foreach $r \in V A s\{$ if $\mathrm{pc}(r)=\ell \wedge \neg$ WELLFOUND LTPreds $[\ell]:=$ false

## Illustrative example

01 VarianceAnalysis $\left(P, L, I^{\sharp}\right)\{$
$02 \quad I A s:=\operatorname{InvarianceAnalysis}\left(P, I^{\sharp}\right)$
03 foreach $\ell \in L\{$
$04 \quad$ LTPreds $[\ell]:=$ true

$$
O:=\operatorname{IsOLATE}(P, L, \ell)
$$

foreach $q \in I A s$ such that $\mathrm{pc}(q)=\ell\{$
$V A s:=\operatorname{InvarianceAnalysis}(O \operatorname{Step}(O,\{\operatorname{SeED}(q)\}))$
foreach $r \in V A s$ \{
if $\mathrm{pc}(r)=\ell \wedge \neg \operatorname{WELLFOUNDEL}(r)\{$
LTPreds [ $\ell]:=$ false

$$
\}
$$

\}
\}
\}
return LTPreds


## Illustrative example

01 VarianceAnalysis $\left(P, L, I^{\sharp}\right)$ \{
$02 \quad I A s:=\operatorname{InvarianceAnalysis}\left(P, I^{\sharp}\right)$
03 foreach $\ell \in L\{$
$04 \quad$ LTPreds $[\ell]:=$ true

$$
p c=83 \wedge x \geq a+1 \wedge y \geq b+1
$$

$05 \quad O:=\operatorname{IsOLATE}(P, L, \ell)$

07

15 return LTPreds
foreach $q \in I A s$ such that $\mathrm{pc}(q)=\ell\{$
$V A s:=\operatorname{InvarianceAnalysis}(O, \operatorname{Step}(O,\{\operatorname{Seed}(q)\}))$
foreach $r \in V A s\{$
if $\mathrm{pc}(r)=\ell \wedge \neg \operatorname{WELLFOUNDED}(r)\{$
LTPreds $[\ell]:=$ false


## Illustrative example

01 VarianceAnalysis $\left(P, L, I^{\sharp}\right)$ \{
$02 \quad I A s:=\operatorname{InvarianceAnalysis}\left(P, I^{\sharp}\right)$
03 foreach $\ell \in L\{$
$04 \quad$ LTPreds $[\ell]:=$ true

$$
p c=83 \wedge x \geq a+1 \wedge y \geq b+1
$$

$05 \quad O:=\operatorname{IsOLATE}(P, L, \ell)$

07
08
09
10
11
12
13
14
$16\}$

foreach $q \in I A s$ such that $\mathrm{pc}(q)=\ell\{$
$V A s:=\operatorname{InvarianceAnalysis}(O, \operatorname{Step}(O,\{\operatorname{SeEd}(q)\}))$
foreach $r \in V A s$ \{
if $\mathrm{pc}(r)=\ell \wedge \neg \mathrm{WEL}^{\circ} \quad \mathrm{pc}=83 \wedge \mathrm{x} \geq \mathrm{a}+1 \wedge \mathrm{y} \geq \mathrm{b}+1$ LTPreds $[\ell]:=\mathrm{fa} \quad \begin{gathered}\mathrm{pc}=83 \wedge \mathrm{x} \geq \mathrm{a}+1 \wedge \mathrm{y} \geq \mathrm{b}+1 \\ \wedge \mathrm{pc}_{\mathrm{s}}=\mathrm{pc} \wedge \mathrm{x}_{\mathrm{s}}=\mathrm{x} \wedge \mathrm{y}_{\mathrm{s}}=\mathrm{y} \wedge \mathrm{a}_{\mathrm{s}}=\mathrm{a} \wedge \mathrm{b}_{\mathrm{s}}=\mathrm{b}\end{gathered}$

| 82 | while (x>a \&\& y>b) \{ |
| :--- | :---: |
| 83 | if (nondet ()) \{ |
| 84 | do \{ |
| 85 | $x=x-1 ;$ |
| 86 | $\}$ while (nondet ()); |

87 \} else \{
$88 \quad y=y-1 ;$
89 \}
90 \}; assume(false);
91 \}

## Illustrative example

01 VarianceAnalysis $\left(P, L, I^{\sharp}\right)$ \{
$02 \quad I A s:=\operatorname{InvarianceAnalysis}\left(P, I^{\sharp}\right)$
03 foreach $\ell \in L\{$
$04 \quad$ LTPreds $[\ell]:=$ true

$$
p c=83 \wedge x \geq a+1 \wedge y \geq b+1
$$

05
07
08
09
10
11
12
13
14
15 return LTPreds
$16\}$
$O:=\operatorname{Isolate}(P, L, \ell)$
foreach $q \in I A s$ such that $\mathrm{pc}(q)=\ell\{$
$V A s:=\operatorname{InvarianceAnalysis}(O, \operatorname{Step}(O,\{\operatorname{Seed}(q)\}))$
foreach $r \in \operatorname{VAs}\{$
if $\mathrm{pc}(r)=\ell \wedge \neg$ WeLLF $\quad \mathrm{pc}=83 \wedge \mathrm{x} \geq \mathrm{a}+1 \wedge \mathrm{y} \geq \mathrm{b}+1$
LTPreds $[\ell]:=\mathrm{fa}$.
\} $\quad \wedge \mathrm{pc}_{\mathrm{s}}=\mathrm{pc} \wedge \mathrm{x}_{\mathrm{s}}=\mathrm{x} \wedge \mathrm{y}_{\mathrm{s}}=\mathrm{y} \wedge \mathrm{a}_{\mathrm{s}}=\mathrm{a} \wedge \mathrm{b}_{\mathrm{s}}=\mathrm{b}$
$\{(\mathrm{s}, \mathrm{t}) \mid \mathrm{s}(\mathrm{pc})=\mathrm{t}(\mathrm{pc})=83$
$\wedge s(x)=t(x)$
$\wedge s(y)=t(y)$
$\wedge s(a)=t(a)$
$\wedge s(b)=t(b)$
$\wedge t(x) \geq t(a)+1$
$\wedge t(y) \geq t(b)+1\}$
90 \}; assume(false);
91 \}

## Illustrative example

01 VarianceAnalysis $\left(P, L, I^{\sharp}\right)\{$
$02 \quad I A s:=\operatorname{InvarianceAnalysis}\left(P, I^{\sharp}\right)$
03 foreach $\ell \in L$ \{
$04 \quad$ LTPreds $[\ell]:=$ true

$$
p c=83 \wedge x \geq a+1 \wedge y \geq b+1
$$

$05 \quad O:=\operatorname{Isolate}(P, L, \ell)$
06 foreach $q \in I A s$ such that $\mathrm{pc}(q)=\ell\{$
$07 \quad V A s:=\operatorname{InvarianceAnalysis}(O, \operatorname{Step}(O,\{\operatorname{SeEd}(q)\}))$
08
09
10 foreach $r \in V A s\{$ if $\mathrm{pc}(r)=\ell \wedge \neg$ WeLr $\mathrm{pc}=83 \wedge \mathrm{x} \geq \mathrm{a}+1 \wedge \mathrm{y} \geq \mathrm{b}+1$


15 return LTPreds
$16\}$

## Illustrative example

$01 \operatorname{VarianceAnalysis}\left(P, L, I^{\sharp}\right)\{$
$02 \quad I A s:=\operatorname{InvarianceAnalysis}\left(P, I^{\sharp}\right)$
03 foreach $\ell \in L\{$
$04 \quad$ LTPreds $[\ell]:=$ true
$05 \quad O:=\operatorname{IsOLATE}(P, L, \ell)$
$06 \quad$ foreach $q \in I A s$ such that $\mathrm{pc}(q)=\ell\{$
$07 \quad V A s:=\operatorname{InvarianceAnalysis}(O, \operatorname{StEp}(O,\{\operatorname{SeEd}(q)\}))$
08
09
10
foreach $r \in V A s\{$
if $\mathrm{pc}(r)=\ell \wedge \neg \mathrm{WELLFOUNDED}(r)\{$
LTPreds $[\ell]:=$ false


## Illustrative example

$$
\begin{gathered}
\supseteq\left\{\mathrm{pc}_{s}=83 \wedge p c=83 \wedge x \geq a+1 \wedge y \geq b+1\right. \\
\wedge x_{s} \geq x+1 \wedge y_{s} \geq y \wedge a_{s}=a \wedge b_{s}=b
\end{gathered}
$$

01 VarianceAnalysis $(P, L$,
$02 \quad I A s:=$ InvarianceAnal
03 foreach $\ell \in L\{$
04

$$
\left.05 \quad O:=\text { IsOLAY } \quad \wedge \mathrm{x}_{\mathrm{s}} \geq \mathrm{x}+1 \wedge \mathrm{y}_{\mathrm{s}} \geq \mathrm{y}+1 \wedge \mathrm{a}_{\mathrm{s}}=\mathrm{a} \wedge \mathrm{~b}_{\mathrm{s}}=\mathrm{b}\right\}
$$

06 foreach $\rightarrow$ IAs such that $\mathrm{pc}(q)=\ell$
$07 V A s:=\operatorname{InvarianceAnalysis}(O, \operatorname{Step}(O,\{\operatorname{SeEd}(q)\}))$
foreach $r \in V A s\{$
if $\mathrm{pc}(r)=\ell \wedge \neg \operatorname{WELLFOUNDED}(r)\{$
LTPreds $[\ell]:=$ false



## Illustrative example

$$
\begin{gathered}
\supseteq\left\{\mathrm{pc}_{s}=83 \wedge p c=83 \wedge x \geq a+1 \wedge y \geq b+1\right. \\
\wedge x_{s} \geq x+1 \wedge y_{s} \geq y \wedge a_{s}=a \wedge b_{s}=b \\
, p c_{s}=83 \wedge p c=83 \wedge x \geq a+1 \wedge y \geq b+1 \\
\wedge x_{s} \geq x \wedge y_{s} \geq y+1 \wedge a_{s}=a \wedge b_{s}=b
\end{gathered}
$$

01 VarianceAnalysis $(P, L, 1$
02 IAs := INVARIANCEANAI
03 foreach $\ell \in L\{$
04

05

## 06

07


09
10
11
12
13
$V A s:=\operatorname{InvarianceAnalysis}(O, \operatorname{Step}(O,\{\operatorname{Seed}(q)\}))$
foreach $r \in V A s\{$
if $\mathrm{pc}(r)=\ell \wedge \neg \operatorname{WELLFOUNDED}(r)\{$
LTPreds $[\ell]:=$ false
 disjunction of well-founded relations that over-approximates $\mathrm{R}^{+}$. Then isolated program terminates by Podelski \& Rybalchenko [LICSO4]
"A superset of the possible transitions from states at 83 to states also at line 83 reachable in 1 or more steps of the program's execution" \}
return LTPreds
$\qquad$


## Remarks

$\rightarrow$ Speed: the induced termination provers are fast:

- 0.07s for Octagon-based prover on this example, vs 8.3s for Terminator
$\rightarrow$ Automatic:
- Termination arguments are automatically found and checked
$\rightarrow$ Disjunctive termination arguments:
- Disjunctive decomposition under the control of the invariance analysis
- Allows using invariance analyzers based on simpler domains
- Traditional ranking function for blue loop is:

$$
f(s)=s(x)+s(y)
$$

and the program's transition relation
(whose coverage must be proven) is:

$$
\{(s, t) \mid s(x)+s(y) \geq t(x)+t(y)-1 \wedge t(x)+t(y) \geq 0\}
$$

Note the 4 -variable inequality.
$\rightarrow$ Dynamic seeding: improved precision

- Seeding may be done after some disjunctive decomposition
- Auxiliary information kept by the invariance analysis can be seeded
$\rightarrow$ No rank function synthesis:
- Well-foundedness checks only need boolean result, a full rank-function synthesizer is unnecessary
$\rightarrow$ Some usable information is computed whether or not overall termination is established
- The well-founded disjuncts that are found provide refinement-based tools like Terminator with a much better starting point
$\rightarrow$ Robust wrt nested loops, etc. by use of standard analysis methods
- Fits in comfortably with cutpoint decomposition techniques
$\rightarrow$ Over-approximation of program's transition relation holds by construction, in Terminator checking this is the performance bottleneck
$\rightarrow$ Seed encodes a binary relation on states into a predicate on states
$\rightarrow$ Ghost state is the additional information in a state used to represent a relation (the seed variables)
$\rightarrow$ Seeding must introduce ghost state, approximating copying the state, in a fashion such that:
- The concrete semantics is independent of any ghost state
- The abstract semantics (InvarianceAnalysis) must ignore the ghost state and not introduce spurious facts about it
$\rightarrow$ WellFounded must soundly check well-foundedness of the relations seeded states represent
and of course:
$\rightarrow$ Step and InvarianceAnalysis must be sound over-approximations of the program's concrete semantics


# Induced termination provers for numerical domains <br> earch Camoridge 

$\rightarrow$ Take a conventional invariance analysis based on the Ocatgon or Polyhedra abstract domains
$\rightarrow$ Fit a post-analysis phase that recovers some disjunctive information
$\rightarrow$ Define:

$$
\begin{array}{ll}
\operatorname{SeEd}(F) & \triangleq F \wedge \bigwedge_{v \in \operatorname{PVar}}\{v=\rho(v)\} \\
\operatorname{WellFounded}(F) & \triangleq \operatorname{WFChECK}(\rho(\operatorname{PVar}), \operatorname{PVar}, F)
\end{array}
$$

- $\rho$ is a bijection between program and seed variables
- WfCheck can be e.g. RankFinder or PolyRank
$\rightarrow$ That's it!


# Induced termination provers for numerical domains 

|  | 1 |  | 2 |  | 3 |  | 4 |  | 5 |  | 6 |  |
| :---: | :---: | :---: | :---: | :---: | ---: | :---: | :---: | :---: | ---: | ---: | :---: | :---: |
| $\mathbf{O}$ | 0.11 | $\checkmark$ | 0.08 | $\checkmark$ | 6.03 | $\checkmark$ | 1.02 | $\checkmark$ | 0.16 | $\checkmark$ | 0.76 | $\checkmark$ |
| P | 1.40 | $\checkmark$ | 1.30 | $\checkmark$ | 10.90 | $\checkmark$ | 2.12 | $\checkmark$ | 1.80 | $\checkmark$ | 1.89 | $\checkmark$ |
| PR | 0.02 | $\checkmark$ | 0.01 | $\checkmark$ | T/O | - | T/O | - | T/O | - | T/O | - |
| T | 6.31 | $\checkmark$ | 4.93 | $\checkmark$ | T/O | - | T/O | - | 33.24 | $\checkmark$ | 3.98 | $\checkmark$ |

(a) Results from experiments with termination tools on arithmetic examples from the Octagon Library distribution.

|  | 1 |  | 2 |  | 3 |  | 4 |  | 6 |  | 7 |  | 8 |  | 9 |  | 10 |  | 11 |  | 12 |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| O | 0.30 | $\dagger$ | 0.05 | $\dagger$ | 0.11 | $\dagger$ | 0.50 | I | 0.10 | † | 0.17 | $\dagger$ | 0.16 | + | 0.12 | $\dagger$ | 0.35 | - | 0.86 | + | 0.12 | $\dagger$ |
| P | 1.42 | $\checkmark$ | 0.82 | $\checkmark$ | 1.06 | $\dagger$ | 2.29 | $\dagger$ | 2.61 | $\dagger$ | 1.28 | $\dagger$ | 0.24 | $\dagger$ | 1.36 | $\checkmark$ | 1.69 | $\dagger$ | 1.56 | $\dagger$ | 1.05 | $\dagger$ |
| PR | 0.21 | $\checkmark$ | 0.13 | $\checkmark$ | 0.44 | $\checkmark$ | 1.62 | $\checkmark$ | 3.88 | $\checkmark$ | 0.11 | $\checkmark$ | 2.02 | $\checkmark$ | 1.33 | $\checkmark$ | 13.34 | $\checkmark$ | 174.55 | $\checkmark$ | 0.15 | $\checkmark$ |
| T | 435.23 | $\checkmark$ | 61.15 | $\checkmark$ | T/O | - | T/O | - | 75.33 | $\checkmark$ | T/O | - | T/O | - | T/O | - | T/O | - | T/O | - | 10.31 | $\dagger$ |

(b) Results from experiments with termination tools on arithmetic examples from the PolyRank distribution.

|  | 1 |  | 2 |  | 3 |  | 4 |  | 5 |  | 6 |  | 7 |  | 8 |  | 9 |  | 10 |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 0 | 1.42 | $\checkmark$ | 1.67 | $\bigcirc$ | 0.47 | $\bigcirc$ | 0.18 | $\checkmark$ | 0.06 | $\checkmark$ | 0.53 | $\checkmark$ | 0.50 | $\checkmark$ | 0.32 | $\checkmark$ | 0.14 | $\bigcirc$ | 0.17 | $\checkmark$ |
| P | 4.66 | $\checkmark$ | 6.35 | $\bigcirc$ | 1.48 | $\bigcirc$ | 1.10 | $\checkmark$ | 1.30 | $\checkmark$ | 1.60 | $\checkmark$ | 2.65 | $\checkmark$ | 1.89 | $\checkmark$ | 2.42 | $\bigcirc$ | 1.27 | $\checkmark$ |
| PR | T/O | - | T/O | - | T/O | - | T/O | - | 0.10 | $\checkmark$ | T/O | - | T/O | - | T/O | - | T/O | - | 0.31 | $\checkmark$ |
| T | 10.22 | $\checkmark$ | 31.51 | $\bigcirc$ | 20.65 | $\bigcirc$ | 4.05 | $\checkmark$ | 12.63 | $\checkmark$ | 67.11 | $\checkmark$ | 298.45 | $\checkmark$ | 444.78 | $\checkmark$ | T/O | - | 55.28 | $\checkmark$ |

(c) Results from experiments with termination tools on small arithmetic examples taken from Windows device drivers. Note that the examples are small as they must currently be hand-translated for the three tools that do not accept $C$ syntax.
$\rightarrow$ Take Sonar, the separation-logic based shape analysis that tracks sizes of abstracted portions of the heap
$\rightarrow$ No post-analysis, the Sonar analysis is already fully disjunctive
$\rightarrow$ Define:

$$
\begin{array}{cl}
\quad \operatorname{SEED}(\Pi \wedge \Sigma) & \triangleq\left(\Pi \wedge \Sigma \wedge \bigwedge_{v \in \operatorname{fDV}(\Pi \wedge \Sigma)}\{v=\rho(v)\}\right) \\
\operatorname{SEED}(\top) \triangleq \top \\
\operatorname{WELLFOUNDED}(\Pi \wedge \Sigma) & \triangleq \operatorname{WFCHECK}(\rho(\mathrm{DVar}), \operatorname{DVar}, \Pi) \\
\operatorname{WELLFOUNDED}(\top) \triangleq \text { false }
\end{array}
$$

- $\rho$ is a bijection between list length and seeded length variables
- WfCheck can be e.g. RankFinder or PolyRank
$\rightarrow$ Surprisingly similar to instantiation for numerical domains, despite the underlying analyses being radically different


## Induced termination prover for shape analysis

| Loop | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 | 14 | 15 | 16 | 17 | 18 | 19 | 20 | 21 |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| Time (s) | 0.0 | 0.0 | 8.0 | 0.3 | 1.7 | 13 | 296 | 0.1 | 5.4 | 0.0 | 8.2 | 821 | 0.0 | 1.6 | 152 | 0.0 | 2.6 | 3.5 | 58 | 32 | 261 |
| Result | $\checkmark$ | $\varnothing$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\varnothing$ | $\varnothing$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\checkmark$ | $\oslash$ | $\checkmark$ | $\oslash$ | $\checkmark$ | $\checkmark$ |
| WF checks | 1 | 4 | 16 | 3 | 5 | 9 | 15 | 2 | 4 | 1 | 6 | 39 | 1 | 3 | 16 | 1 | 28 | 9 | 85 | 20 | 37 |

$\rightarrow$ Results on examples Terminator flags as buggy
$\rightarrow 1$ false bug reported: loop 8, essentially reversing a pan-handle list
$\rightarrow$ Variance analyses can be constructed from invariance analyses
$\rightarrow$ Resulting termination provers are fast: at least competitive with the state-of-the art
$\rightarrow$ Even (quickly) failed proofs can help other provers
$\rightarrow$ Usual analysis techniques for varying the precision versus performance balance can now be done for termination
$\rightarrow$ Questions?
details in a paper to appear in POPL

