

BOXES: A Symbolic Abstract Domain of Boxes

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Disjunctive Refinement of an Abstract Domain

Bounded disjunctions

- extend base domain with disjunctions of size at most k
- *all* operations are done by lifting corresponding base domain operations
- easy to implement by modifying program control flow graph

Finite Powerset Domain [Bagnara et al.]

- extend base domain with all *finite* disjunctions
- *most* operations are done by lifting corresponding base domain operations
- finding a good widening is complex (and often tricky)

Predicate Abstraction

- extend *finite* base domain with *all* disjunctions
- domain elements are represented by BDDs
- no widening required



Outline

Boxes: semantics, representation, operations

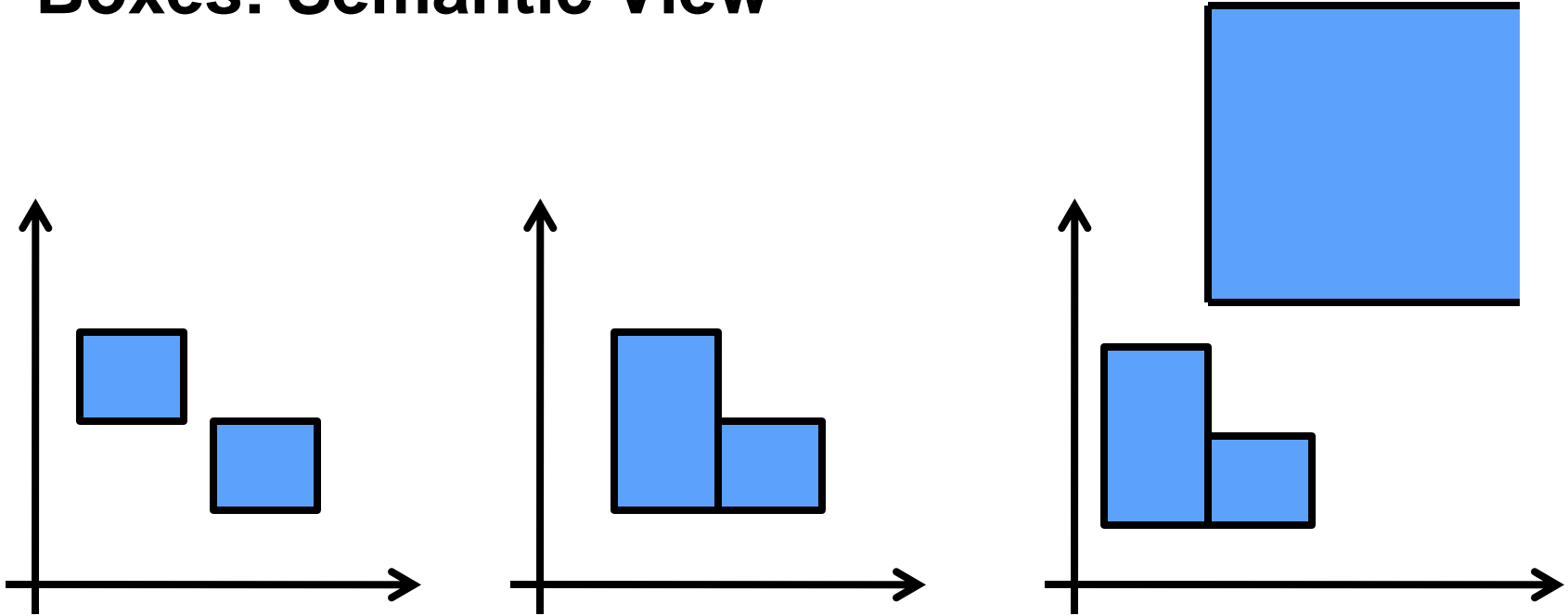
Widening

Experiments

Conclusion



Boxes: Semantic View



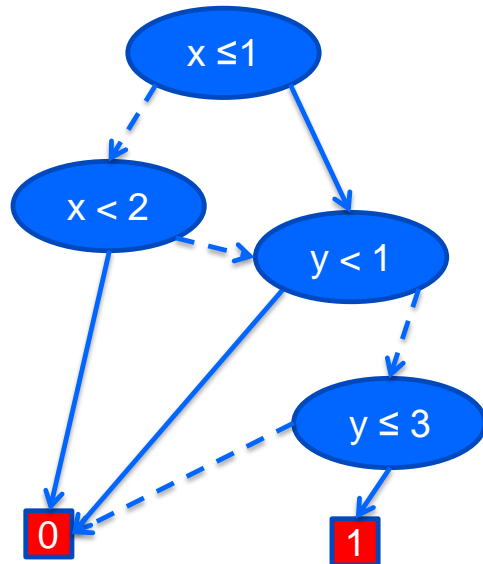
Boxes are “finite union of box values”
(alternatively)

Boxes are “Boolean formulas over interval constraints”

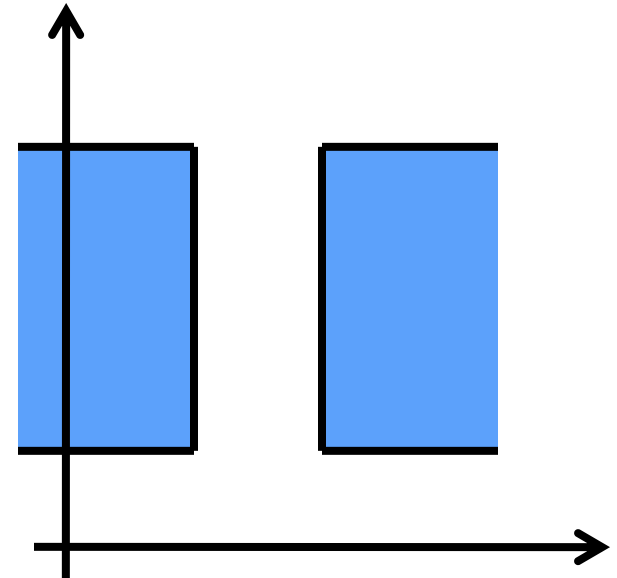


Boxes: Representation

LDD



Semantics



Represented by (Interval) Linear Decision Diagrams (LDD)

- BDDs + non-terminal nodes are labeled by interval constraints + extra rules
- retain complexity of BDD operations
- canonical for Boxes
- available at <http://lindd.sf.net>



Domain Operations

Basic domain operations are implemented by LDD operations

meet

Operation	Complexity
$f \wedge g$	$O(f g)$
$\text{ITE}(h, f, g)$	$O(h f g)$
$\neg f$	$O(1)$

order
(semantic)

join

Operation	Complexity
$f \vee g$	$O(f g)$
$f \Rightarrow g$	$O(f g)$
$\exists U. f$	$O(f 2^{ U })$

Additional operations

projection

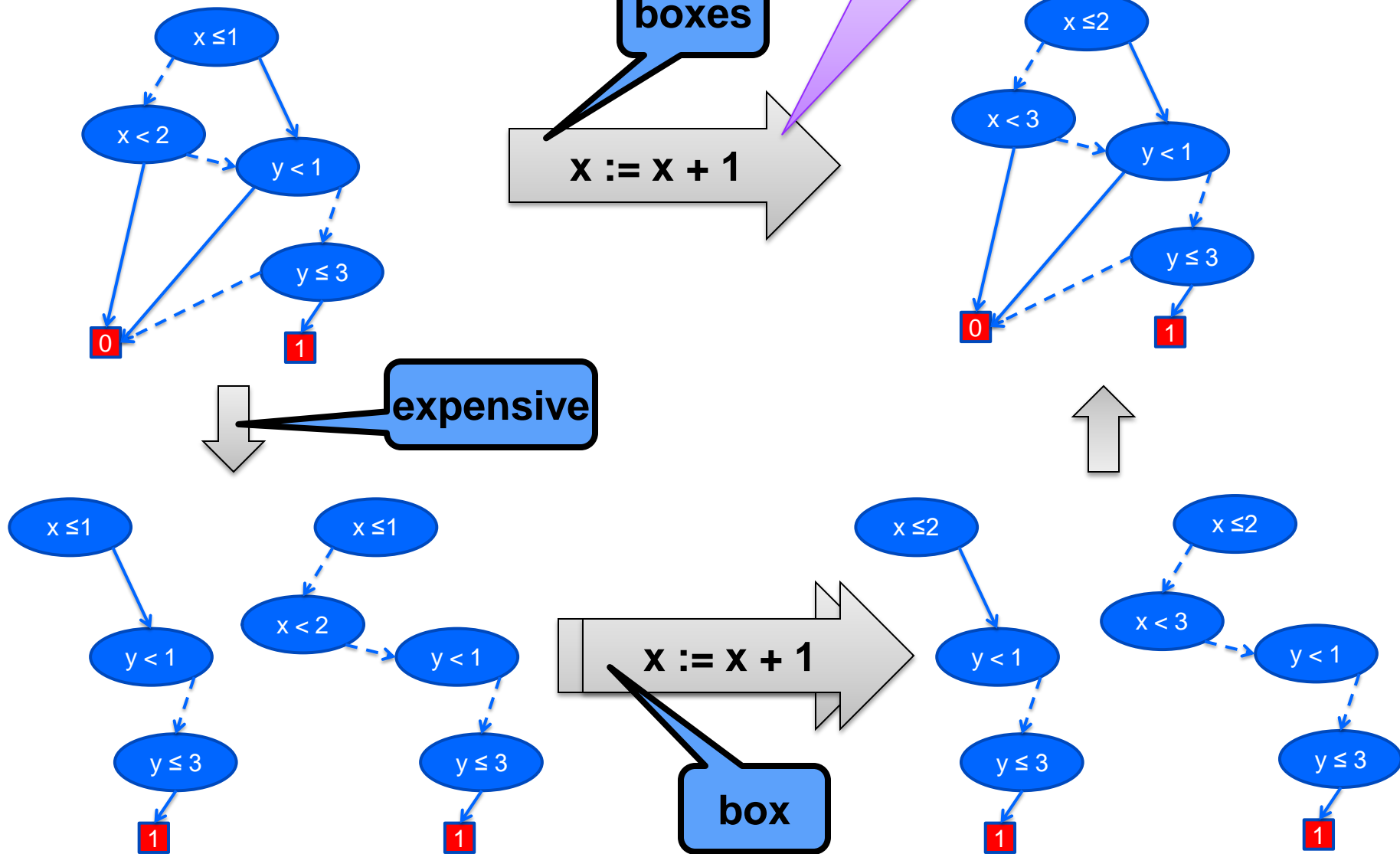
- set difference $f \setminus g$ implemented by $f \wedge \neg g$
- $\text{BoxHull}(f)$ – smallest Box containing f
- $\text{BoxJoin}(f, g)$ – smallest Box containing the union of $\text{Box } f$ and $\text{Box } g$

used to compare
Box and Boxes

All operations are polynomial in the size of the representation



Transfer Functions



Outline

Boxes: semantics, representation, operations

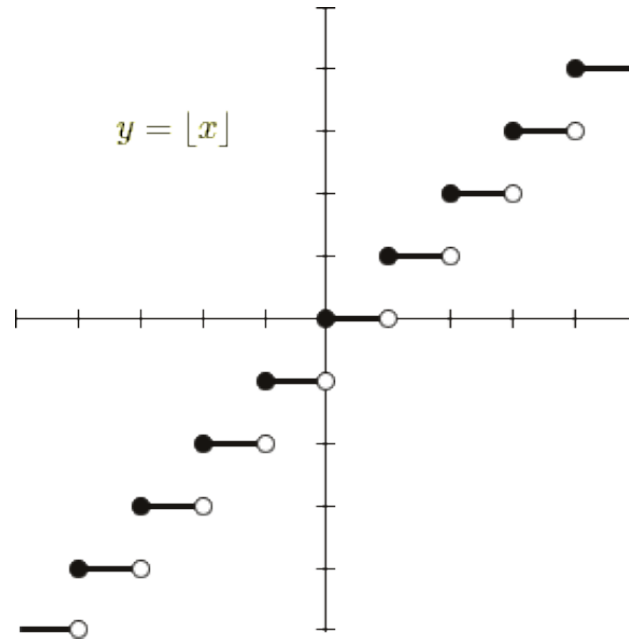
Widening

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Step Function



A function on the reals \mathbb{R} is a *step function* if it can be written as a *finite* linear combination of semi-open intervals

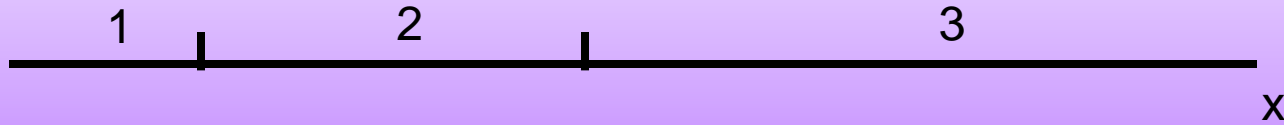
$$f(x) = \alpha_1 f_1(x) + \dots + \alpha_n f_n(x)$$

where $f_i \in \mathbb{R}$ and $\alpha_i(x)=1$ if $x \in [a_i, b_i)$ and 0 otherwise, for $i=1, \dots, n$

[Weisstein, Eric W. "Step Function." From *MathWorld*--A Wolfram Web Resource.](http://mathworld.wolfram.com/StepFunction.html)
<http://mathworld.wolfram.com/StepFunction.html>

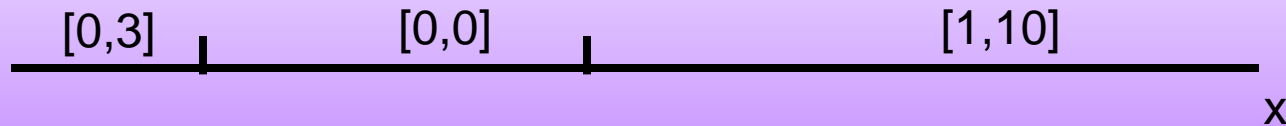


Step Functions as an Abstract Domain



Step Functions as an Abstract Domain

interval

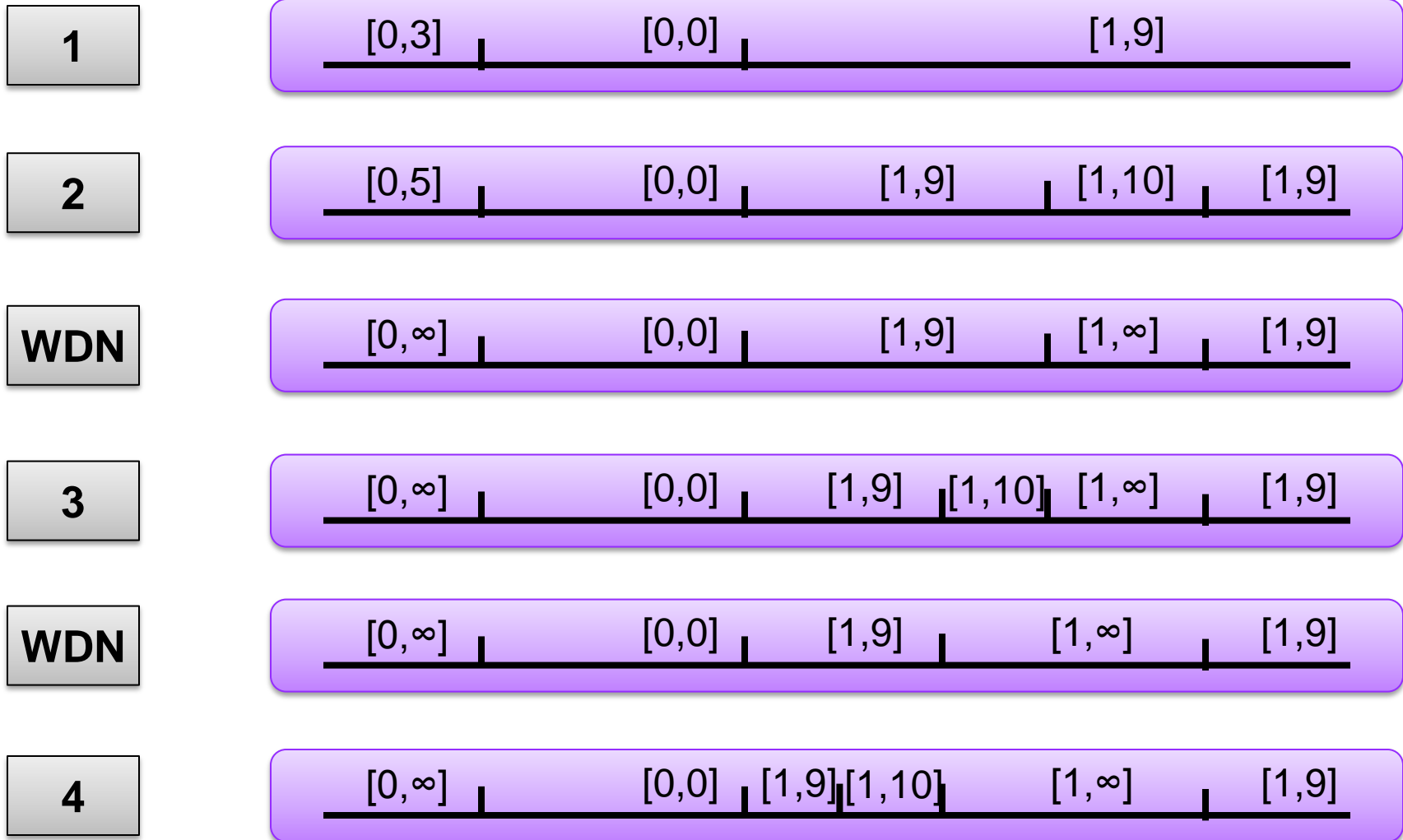


STEP(D) an abstract domain of step functions over an abstract domain D

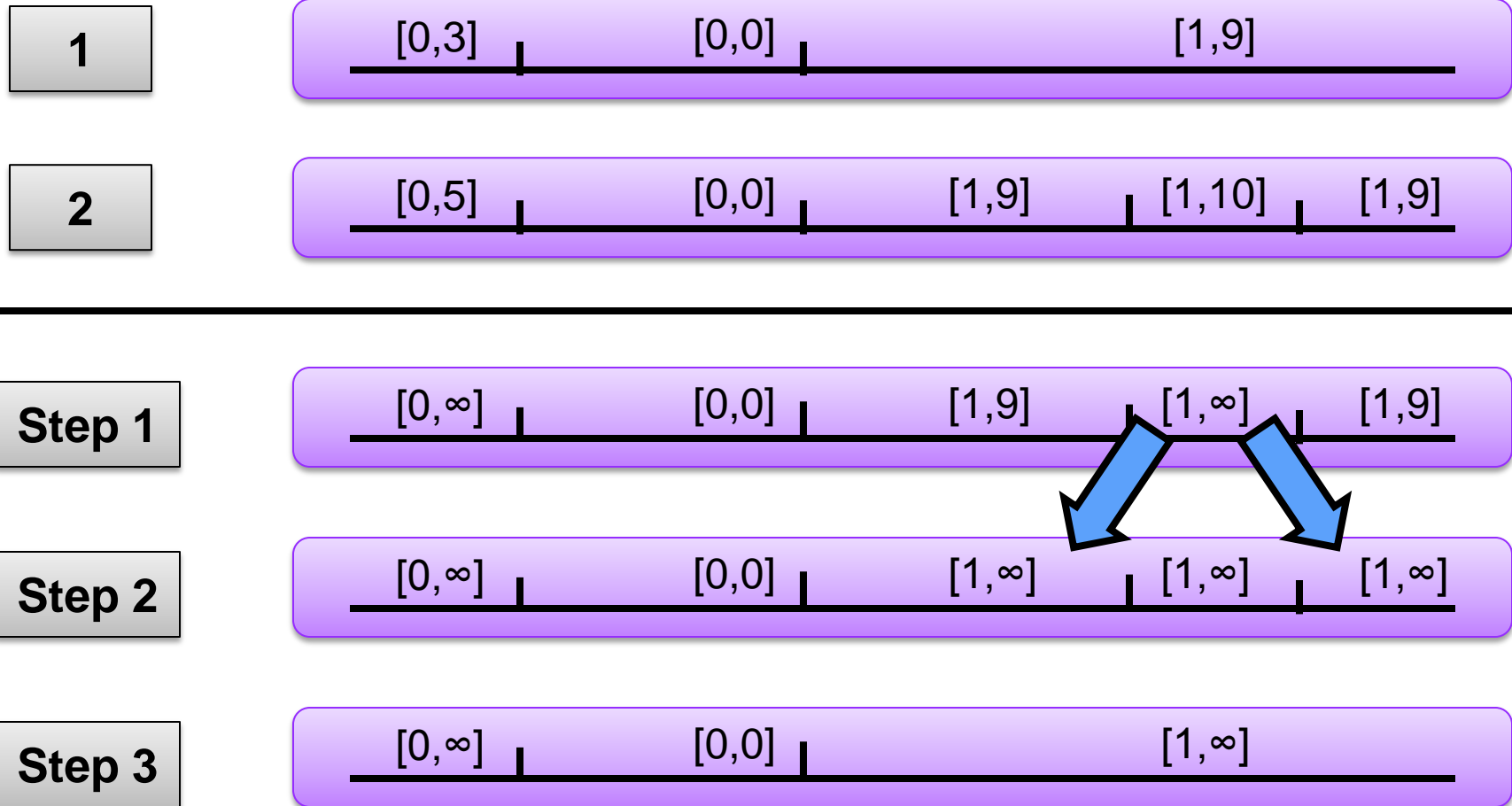
- elements are step functions $\mathbb{R} \rightarrow D$
- order is pointwise: $f \sqsubseteq g$ iff $\forall x . f(x) \sqsubseteq_D g(x)$
- join is pointwise: $f \sqcup g$ is $\lambda x . f(x) \sqcup_D g(x)$
- meet is pointwise: $f \sqcap g$ is $\lambda x . f(x) \sqcap_D g(x)$
- widen is pointwise: $f \nabla g$ is $\lambda x . f(x) \nabla_D g(x)$????



Pointwise Extension of Widen Diverges



Widening for Step Functions

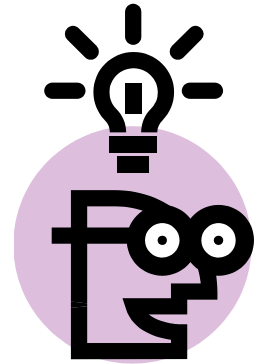


Back to Boxes

Boxes are Step functions!

- 1-dim Boxes are $\text{STEP}(\{\perp, \top\})$
- 2-dim Boxes are $\text{STEP}(\text{STEP}(\{\perp, \top\}))$
- n-dim Boxes are $\text{STEP}^n(\{\perp, \top\})$

$$\begin{aligned}\mathbb{R} &\rightarrow \{\perp, \top\} \\ \mathbb{R} &\rightarrow \mathbb{R} \rightarrow \{\perp, \top\} \\ \mathbb{R}^n &\rightarrow \{\perp, \top\}\end{aligned}$$



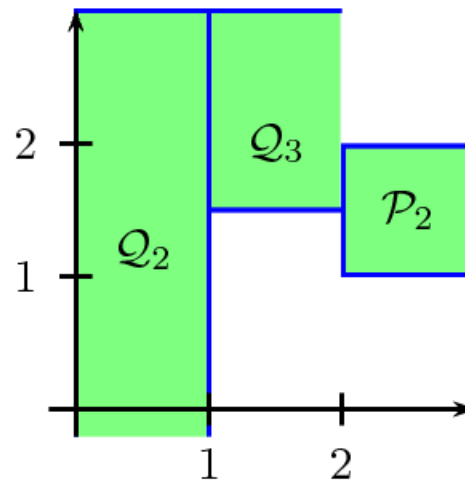
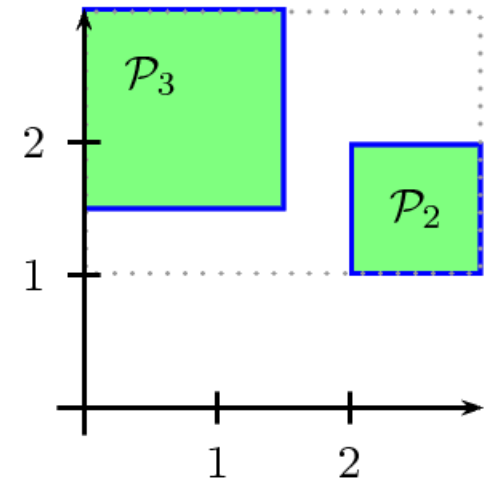
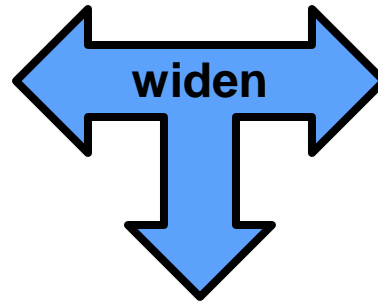
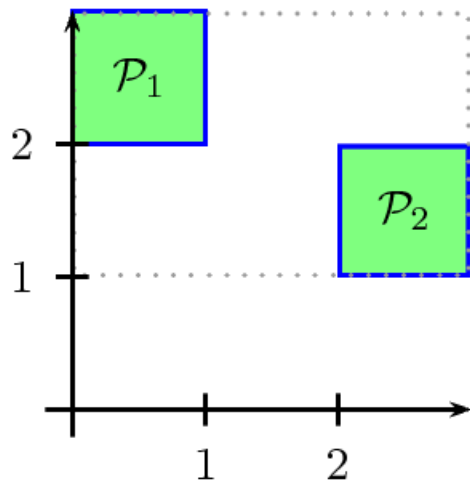
Widen for $\{\perp, \top\}$ is trivial

Widen for n-dim Boxes is defined recursively on dimensions

In the paper, a polynomial time algorithm that implements this widen operator directly on LDDs.



Widen: An Example



Boxes versus Finite Powersets

	Boxes	Finite Powerset
Base domain	Box	Any
Representation	Decision Diagram	Set / DNF
Domain order	semantic	syntactic
Complexity	polynomial in representation	polynomial in representation
Singleton Widen	Box	base domain
Widen	Step Function	Multiple Choices



Experiments: Invariant Computation

Abstract Domains

- LDD Box – Box domain using LDDs
- LDD Boxes – Our Boxes domain using LDDs
- PPL Box – **Rational_Box** of Parma Polyhedra Library (PPL)
- PPL Boxes – **Pointset_Powerset<Rational_Box>** of PPL

Analyzer

- custom analyzer on top of LLVM compiler infrastructure
- computes loop invariants for all loops over all SSA variables in a function

Benchmark

- from open source software: mplayer, CUDD, make, ...
- Stats: 5,727 functions
 - 9 – 9,052 variables (avg. 238, std. 492)
 - 0 – 241 loops (avg. 7, std. 12)

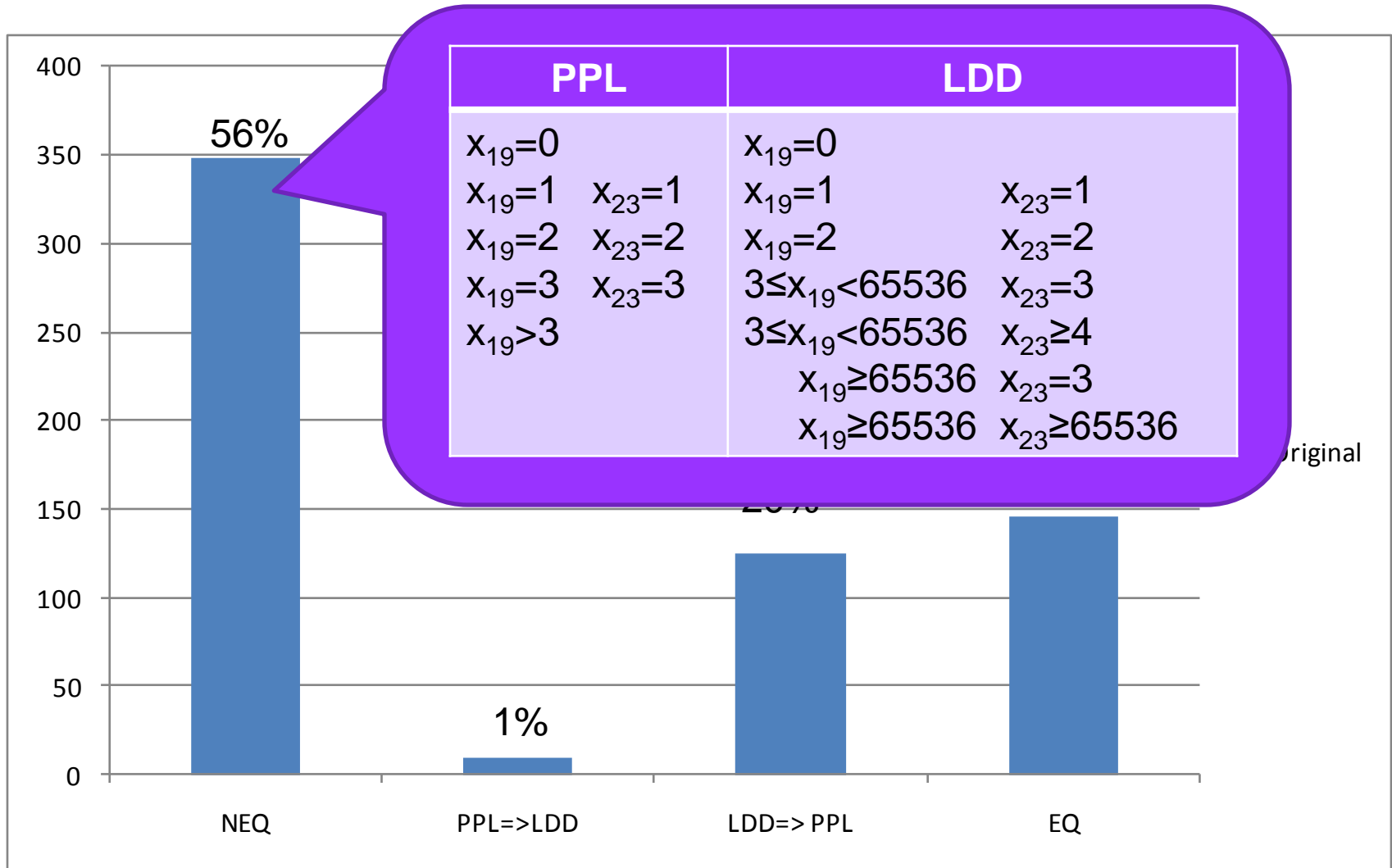


Results: Time

Domain	%Solved (w/ 60s TO)	Time (m)	% in Basic	% in Image	% in Widen
LDD Box	99.8%	4	77%	23%	0%
PPL Box	96.1%	117	86%	14%	0%
LDD Boxes	87.9%	118	61%	38%	1%
PPL Boxes	14.2%	201	95%	1%	3%



Results: Precision



Widening: PPL vs LDD

```
x = 0;
y = 0
while (1){
    x++;
    y++;
}
```

Iteration 1

PPL

x=0 y=0

≡

LDD

x=0 y=0

Iteration 2

x=0 y=0
x=1 y=1

≡

x=0 y=0
x=1 y=1

Widen 1

x=0 y=0
x=1 y=1
 $1 < x$

\supseteq

x=0 y=0
 $1 \leq x$ y=1

Iteration 3

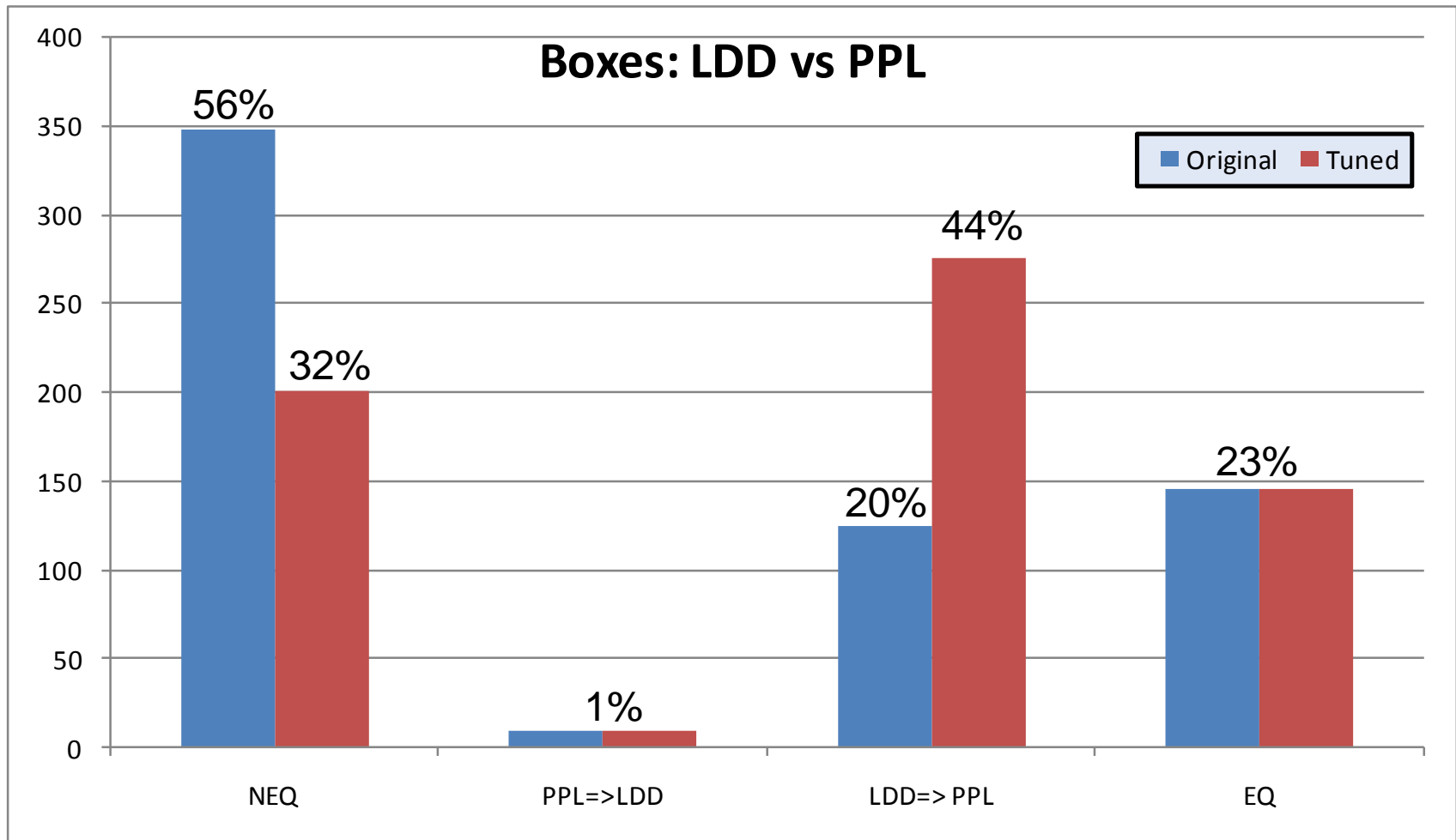
x=0 y=0
 $1 \leq x$ y=1
 $2 \leq x$ y=2

Widen 2

x=0 y=0
 $1 \leq x$ y=1
 $1 \leq x$ $2 \leq y$



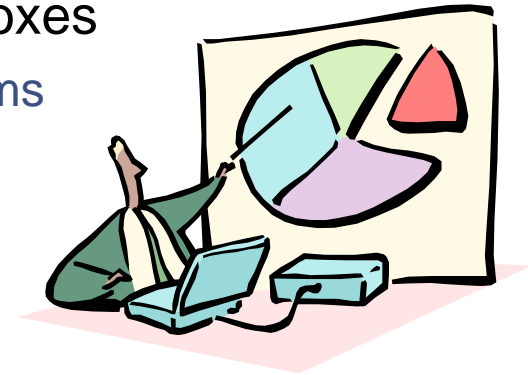
Results: Precision w/ Tuned Widening



Conclusion

Boxes: A new disjunctive abstract domain of sets of boxes

- efficient representation based on Linear Decision Diagrams
- semantic order relation
- efficient operations and widening
- more precise and efficient than finite powersets of box



A new widening scheme

- lifting widening from a base domain to the domain of step functions

Future Work

- applications
- extending the technique to richer base domains, i.e., octagons, TVPI
 - representation and base operations are easy (already exist in LDD)
 - widening?

<http://lindd.sf.net>





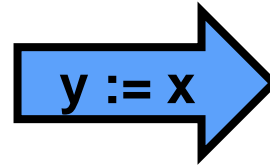
THE END



Transfer Functions: PPL vs LDD

PPL

$x=1$
 $x=2$



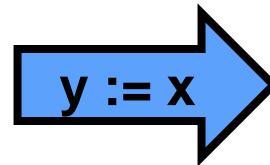
$x=1 \ y=1$
 $x=2 \ y=2$

\equiv

\cap

LDD

$1 \leq x \leq 2$



$1 \leq x \leq 2, 1 \leq y \leq 2$



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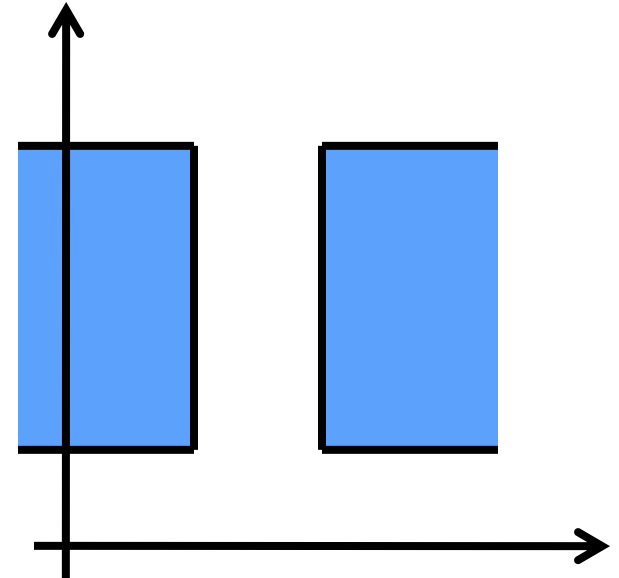
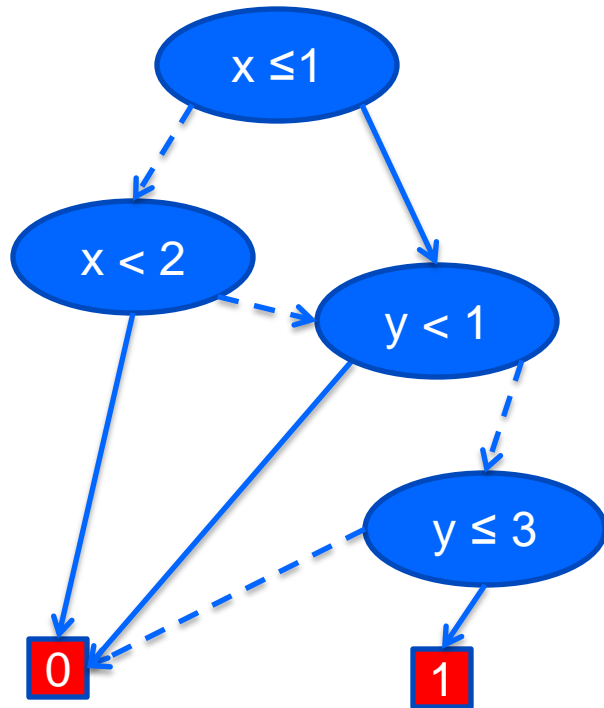
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