

Powerdomains in Isabelle/HOLCF

Brian Huffman

Portland State University

Galois Technical Seminar, February 26, 2008

Outline

1 Motivation

- Introduction to Powerdomains
- Limitations of the List Monad for Nondeterminism

2 Properties of Powerdomains

- Axiomatization of Powerdomains
- Powerdomain Orderings
- Visualizing Powerdomains

3 Formalization in Isabelle

- Definition in Terms of Finite Elements
- Using Powerdomains in Isabelle

Background

I assume familiarity with some basic domain theory:

- Bottoms (\perp)
- Complete partial orders (\sqsubseteq)
- Limits of chains
- Monotone and continuous functions

Outline

1 Motivation

- Introduction to Powerdomains
- Limitations of the List Monad for Nondeterminism

2 Properties of Powerdomains

- Axiomatization of Powerdomains
- Powerdomain Orderings
- Visualizing Powerdomains

3 Formalization in Isabelle

- Definition in Terms of Finite Elements
- Using Powerdomains in Isabelle

What are Powerdomains?

A powerdomain is

- a monad
- with a nondeterministic choice operator

Powerdomains adapt the notion of powersets to work with domain theory.

What are Powerdomains?

A powerdomain is

- a monad
- with a nondeterministic choice operator

Powerdomains adapt the notion of powersets to work with domain theory.

What are Powerdomains?

A powerdomain is

- a monad
- with a nondeterministic choice operator

Powerdomains adapt the notion of powersets to work with domain theory.

What are Powerdomains?

A powerdomain is

- a monad
- with a nondeterministic choice operator

Powerdomains adapt the notion of powersets to work with domain theory.

What are Powerdomains Good For?

Powerdomains are good for reasoning about

- Nondeterministic algorithms
 - Write algorithms monadically in a powerdomain
 - Works with arbitrary recursion
- Parallel computation
 - Resumption monad transformer models interleaving
 - Powerdomain models nondeterministic scheduler

What are Powerdomains Good For?

Powerdomains are good for reasoning about

- Nondeterministic algorithms
 - Write algorithms monadically in a powerdomain
 - Works with arbitrary recursion
- Parallel computation
 - Resumption monad transformer models interleaving
 - Powerdomain models nondeterministic scheduler

What are Powerdomains Good For?

Powerdomains are good for reasoning about

- Nondeterministic algorithms
 - Write algorithms monadically in a powerdomain
 - Works with arbitrary recursion
- Parallel computation
 - Resumption monad transformer models interleaving
 - Powerdomain models nondeterministic scheduler

Outline

1 Motivation

- Introduction to Powerdomains
- Limitations of the List Monad for Nondeterminism

2 Properties of Powerdomains

- Axiomatization of Powerdomains
- Powerdomain Orderings
- Visualizing Powerdomains

3 Formalization in Isabelle

- Definition in Terms of Finite Elements
- Using Powerdomains in Isabelle

Using List Monad for Nondeterminism

Good for modeling in Haskell:

- Executable

Bad for denotational semantics:

- Not abstract enough
- Problems with partial/infinite values

Using List Monad for Nondeterminism

Good for modeling in Haskell:

- Executable

Bad for denotational semantics:

- Not abstract enough
- Problems with partial/infinite values

Using List Monad for Nondeterminism

Good for modeling in Haskell:

- Executable

Bad for denotational semantics:

- Not abstract enough
- Problems with partial/infinite values

Using List Monad for Nondeterminism

Good for modeling in Haskell:

- Executable

Bad for denotational semantics:

- Not abstract enough
- Problems with partial/infinite values

Examples Using List Monad in Haskell

- 1 Monadic merge sort with nondeterministic comparison
- 2 Nondeterministically choosing a node in a tree

Monads with Nondeterministic Choice

Haskell type class for monads with nondeterministic choice operator

```
class (Monad m) => MultiMonad m where  
  (+|+) :: m a -> m a -> m a
```

Haskell lists can model nondeterministic computation

```
instance MultiMonad [] where  
  xs +|+ ys = xs ++ ys
```

Monadic Merge Sort

```
mergesort :: (Monad m) =>
  (a -> a -> m Bool) -> [a] -> m [a]

mergesort r [] = return []
mergesort r [x] = return [x]
mergesort r xs = do ys' <- mergesort r ys
                  zs' <- mergesort r zs
                  xs' <- merge r ys' zs'
                  return xs'
  where (ys,zs) = split xs
```

Monadic Merge Sort

```
merge :: (Monad m) =>
  (a -> a -> m Bool) -> [a] -> [a] -> m [a]

merge r xs [] = return xs
merge r [] ys = return ys
merge r (x:xs) (y:ys) =
  do b <- r x y
     if b then do zs <- merge r xs (y:ys)
                  return (x:zs)
           else do zs <- merge r (x:xs) ys
                  return (y:zs)
```

Monadic Merge Sort

```
r1, r2 :: (MultiMonad m) =>
  (Int, a) -> (Int, a) -> m Bool

r1 (x,_) (y,_) =
  case compare x y of
    LT -> return True
    GT -> return False
    EQ -> return True ++ return False

r2 (x,_) (y,_) =
  return (x <= y) ++ return (x < y)
```

Monadic Merge Sort

```
dataset :: [(Int, String)]  
dataset =  
  [(3, "foo"), (2, "bar"), (1, "baz"), (2, "wibble")]
```

- $r1$ is basically equivalent to $r2$
- `mergesort r1 dataset` should be equivalent to `mergesort r2 dataset`
- What happens in Haskell?

Nondeterministic Choice with Binary Trees

```
data Tree a = Node (Tree a) (Tree a) | Leaf a
```

```
pick (Leaf a) = return a
```

```
pick (Node l r) = pick l +|+ pick r
```

```
mirror (Leaf a) = Leaf a
```

```
mirror (Node l r) = Node (mirror r) (mirror l)
```

- `pick (mirror t)` should be equivalent to `pick t`

Nondeterministic Choice with Binary Trees

```
tree1 = Node (Node (Leaf 1) (Leaf 2))  
          (Node (Leaf 3) (Leaf 4))
```

```
tree2 = Node (Node (Leaf 1) (Leaf 2))  
          (Node undefined (Leaf 4))
```

```
tree3 = Node (Node (Leaf 1) tree3)  
          (Node (Leaf 3) (Leaf 4))
```

- What happens in Haskell?

Outline

1 Motivation

- Introduction to Powerdomains
- Limitations of the List Monad for Nondeterminism

2 Properties of Powerdomains

- Axiomatization of Powerdomains
- Powerdomain Orderings
- Visualizing Powerdomains

3 Formalization in Isabelle

- Definition in Terms of Finite Elements
- Using Powerdomains in Isabelle

Powerdomain Axioms

1 Return and bind satisfy monad laws

```
(return x) >>= f == f x
a >>= return == m
(a >>= f) >>= g == a >>= (\x -> f x >>= g)
```

2 Bind distributes over choice operator

```
(a +|+ b) >>= f == (a >>= f) +|+ (b >>= f)
```

3 Choice operator is associative, commutative, idempotent

```
(a +|+ b) +|+ c == a +|+ (b +|+ c)
a +|+ b == b +|+ a
a +|+ a == a
```

Powerdomain Axioms

1 Return and bind satisfy monad laws

```
(return x) >>= f == f x
a >>= return == m
(a >>= f) >>= g == a >>= (\x -> f x >>= g)
```

2 Bind distributes over choice operator

```
(a +|+ b) >>= f == (a >>= f) +|+ (b >>= f)
```

3 Choice operator is associative, commutative, idempotent

```
(a +|+ b) +|+ c == a +|+ (b +|+ c)
a +|+ b == b +|+ a
a +|+ a == a
```

Powerdomain Axioms

1 Return and bind satisfy monad laws

```
(return x) >>= f == f x
a >>= return == m
(a >>= f) >>= g == a >>= (\x -> f x >>= g)
```

2 Bind distributes over choice operator

```
(a +|+ b) >>= f == (a >>= f) +|+ (b >>= f)
```

3 Choice operator is associative, commutative, idempotent

```
(a +|+ b) +|+ c == a +|+ (b +|+ c)
a +|+ b == b +|+ a
a +|+ a == a
```

Powerdomain Axioms

In addition:

- All operations must be **monotone** and **continuous**

Representing Powerdomains with Sets

We can define the powerdomain operations in terms of sets:

```
return x = {x}
a >>= f = (⋃x∈a. f x)
a +|+ b = a ∪ b
```

- Set operations satisfy the monad laws
- Set union is associative, commutative, and idempotent
- What about monotonicity and continuity?
 - First we must define a complete partial order...

Representing Powerdomains with Sets

We can define the powerdomain operations in terms of sets:

```
return x = {x}
a >>= f = (⋃x∈a. f x)
a +|+ b = a ∪ b
```

- Set operations satisfy the monad laws
- Set union is associative, commutative, and idempotent
- What about monotonicity and continuity?
 - First we must define a complete partial order...

Representing Powerdomains with Sets

We can define the powerdomain operations in terms of sets:

```
return x = {x}
a >>= f = (⋃x∈a. f x)
a +|+ b = a ∪ b
```

- Set operations satisfy the monad laws
- Set union is associative, commutative, and idempotent
- What about monotonicity and continuity?
 - First we must define a complete partial order...

Representing Powerdomains with Sets

We can define the powerdomain operations in terms of sets:

```
return x = {x}
a >>= f = (⋃x∈a. f x)
a +|+ b = a ∪ b
```

- Set operations satisfy the monad laws
- Set union is associative, commutative, and idempotent
- What about monotonicity and continuity?
 - First we must define a complete partial order...

Outline

1 Motivation

- Introduction to Powerdomains
- Limitations of the List Monad for Nondeterminism

2 Properties of Powerdomains

- Axiomatization of Powerdomains
- **Powerdomain Orderings**
- Visualizing Powerdomains

3 Formalization in Isabelle

- Definition in Terms of Finite Elements
- Using Powerdomains in Isabelle

The Subset Ordering Does Not Work

The subset relation (\subseteq)

- is a partial order on sets
- is complete (unions give least upper bounds)

But not all operations are monotone w.r.t (\subseteq)

- $x \sqsubseteq y$ does not imply that $\{x\} \subseteq \{y\}$

The Subset Ordering Does Not Work

The subset relation (\subseteq)

- is a partial order on sets
- is complete (unions give least upper bounds)

But not all operations are monotone w.r.t (\subseteq)

- $x \sqsubseteq y$ does not imply that $\{x\} \subseteq \{y\}$

Monotonicity Implies Certain Equivalences

Theorem

Let $x \sqsubseteq y \sqsubseteq z$.

Then as elements of a powerdomain, $\{x, y, z\} = \{x, z\}$.

Proof.

- From $y \sqsubseteq z$ have $\{x, y, z\} \sqsubseteq \{x, z, z\}$ (monotonicity)
- Hence $\{x, y, z\} \sqsubseteq \{x, z\}$ (idempotency)
- From $x \sqsubseteq y$ have $\{x, x, z\} \sqsubseteq \{x, y, z\}$ (monotonicity)
- Hence $\{x, z\} \sqsubseteq \{x, y, z\}$ (idempotency)
- Finally have $\{x, y, z\} = \{x, z\}$ (antisymmetry)



Monotonicity Implies Certain Equivalences

Theorem

Let $x \sqsubseteq y \sqsubseteq z$.

Then as elements of a powerdomain, $\{x, y, z\} = \{x, z\}$.

Proof.

- From $y \sqsubseteq z$ have $\{x, y, z\} \sqsubseteq \{x, z, z\}$ (monotonicity)
- Hence $\{x, y, z\} \sqsubseteq \{x, z\}$ (idempotency)
- From $x \sqsubseteq y$ have $\{x, x, z\} \sqsubseteq \{x, y, z\}$ (monotonicity)
- Hence $\{x, z\} \sqsubseteq \{x, y, z\}$ (idempotency)
- Finally have $\{x, y, z\} = \{x, z\}$ (antisymmetry)



An Ordering That Does Work: The Upper Powerdomain

Upper powerdomain ordering (\sqsubseteq^\sharp)

- Define $(a \sqsubseteq^\sharp b) \iff (\forall y \in b. \exists x \in a. x \sqsubseteq y)$
 - “everything in b is above something in a ”
- Partial *preorder* on sets (not antisymmetric)
 - Every set equivalent to its upward-closure
- All operations are monotone w.r.t. (\sqsubseteq^\sharp)
- Satisfies an additional law: $a \cup b \sqsubseteq^\sharp a$
 - Union is greatest lower bound (meet) w.r.t. (\sqsubseteq^\sharp)

An Ordering That Does Work: The Upper Powerdomain

Upper powerdomain ordering (\sqsubseteq^\sharp)

- Define $(a \sqsubseteq^\sharp b) \iff (\forall y \in b. \exists x \in a. x \sqsubseteq y)$
 - “everything in b is above something in a ”
- Partial *preorder* on sets (not antisymmetric)
 - Every set equivalent to its upward-closure
- All operations are monotone w.r.t. (\sqsubseteq^\sharp)
- Satisfies an additional law: $a \cup b \sqsubseteq^\sharp a$
 - Union is greatest lower bound (meet) w.r.t. (\sqsubseteq^\sharp)

An Ordering That Does Work: The Upper Powerdomain

Upper powerdomain ordering (\sqsubseteq^\sharp)

- Define $(a \sqsubseteq^\sharp b) \iff (\forall y \in b. \exists x \in a. x \sqsubseteq y)$
 - “everything in b is above something in a ”
- Partial *preorder* on sets (not antisymmetric)
 - Every set equivalent to its upward-closure
- All operations are monotone w.r.t. (\sqsubseteq^\sharp)
- Satisfies an additional law: $a \cup b \sqsubseteq^\sharp a$
 - Union is greatest lower bound (meet) w.r.t. (\sqsubseteq^\sharp)

An Ordering That Does Work: The Upper Powerdomain

Upper powerdomain ordering (\sqsubseteq^\sharp)

- Define $(a \sqsubseteq^\sharp b) \iff (\forall y \in b. \exists x \in a. x \sqsubseteq y)$
 - “everything in b is above something in a ”
- Partial *preorder* on sets (not antisymmetric)
 - Every set equivalent to its upward-closure
- All operations are monotone w.r.t. (\sqsubseteq^\sharp)
- Satisfies an additional law: $a \cup b \sqsubseteq^\sharp a$
 - Union is greatest lower bound (meet) w.r.t. (\sqsubseteq^\sharp)

Another Ordering That Works: The Lower Powerdomain

Lower powerdomain ordering (\sqsubseteq^b)

- Define $(a \sqsubseteq^b b) \iff (\forall x \in a. \exists y \in b. x \sqsubseteq y)$
 - “everything in a is below something in b ”
- Partial *preorder* on sets (not antisymmetric)
 - Every set equivalent to its downward-closure
- All operations are monotone w.r.t. (\sqsubseteq^\sharp)
- Satisfies an additional law: $a \sqsubseteq^b a \cup b$
 - Union is least upper bound (join) w.r.t. (\sqsubseteq^b)

Another Ordering That Works: The Lower Powerdomain

Lower powerdomain ordering (\sqsubseteq^b)

- Define $(a \sqsubseteq^b b) \iff (\forall x \in a. \exists y \in b. x \sqsubseteq y)$
 - “everything in a is below something in b ”
- Partial *preorder* on sets (not antisymmetric)
 - Every set equivalent to its downward-closure
- All operations are monotone w.r.t. (\sqsubseteq^\sharp)
- Satisfies an additional law: $a \sqsubseteq^b a \cup b$
 - Union is least upper bound (join) w.r.t. (\sqsubseteq^b)

Another Ordering That Works: The Lower Powerdomain

Lower powerdomain ordering (\sqsubseteq^b)

- Define $(a \sqsubseteq^b b) \iff (\forall x \in a. \exists y \in b. x \sqsubseteq y)$
 - “everything in a is below something in b ”
- Partial *preorder* on sets (not antisymmetric)
 - Every set equivalent to its downward-closure
- All operations are monotone w.r.t. $(\sqsubseteq^\#)$
- Satisfies an additional law: $a \sqsubseteq^b a \cup b$
 - Union is least upper bound (join) w.r.t. (\sqsubseteq^b)

Another Ordering That Works: The Lower Powerdomain

Lower powerdomain ordering (\sqsubseteq^b)

- Define $(a \sqsubseteq^b b) \iff (\forall x \in a. \exists y \in b. x \sqsubseteq y)$
 - “everything in a is below something in b ”
- Partial *preorder* on sets (not antisymmetric)
 - Every set equivalent to its downward-closure
- All operations are monotone w.r.t. $(\sqsubseteq^\#)$
- Satisfies an additional law: $a \sqsubseteq^b a \cup b$
 - Union is least upper bound (join) w.r.t. (\sqsubseteq^b)

A Third Ordering That Works: The Convex Powerdomain

Convex powerdomain ordering (\sqsubseteq^{\natural})

- Define $(a \sqsubseteq^{\natural} b) \iff (a \sqsubseteq^{\#} b) \wedge (a \sqsubseteq^b b)$
- Partial *preorder* on sets (not antisymmetric)
 - Every set equivalent to its convex-closure
- All operations are monotone w.r.t. (\sqsubseteq^{\natural})
- Satisfies no additional laws
 - Is the continuous free algebra satisfying powerdomain axioms

A Third Ordering That Works: The Convex Powerdomain

Convex powerdomain ordering (\sqsubseteq^{\natural})

- Define $(a \sqsubseteq^{\natural} b) \iff (a \sqsubseteq^{\#} b) \wedge (a \sqsubseteq^b b)$
- Partial *preorder* on sets (not antisymmetric)
 - Every set equivalent to its convex-closure
- All operations are monotone w.r.t. (\sqsubseteq^{\natural})
- Satisfies no additional laws
 - Is the continuous free algebra satisfying powerdomain axioms

A Third Ordering That Works: The Convex Powerdomain

Convex powerdomain ordering (\sqsubseteq^{\natural})

- Define $(a \sqsubseteq^{\natural} b) \iff (a \sqsubseteq^{\#} b) \wedge (a \sqsubseteq^b b)$
- Partial *preorder* on sets (not antisymmetric)
 - Every set equivalent to its convex-closure
- All operations are monotone w.r.t. (\sqsubseteq^{\natural})
- Satisfies no additional laws
 - Is the continuous free algebra satisfying powerdomain axioms

A Third Ordering That Works: The Convex Powerdomain

Convex powerdomain ordering (\sqsubseteq^{\natural})

- Define $(a \sqsubseteq^{\natural} b) \iff (a \sqsubseteq^{\#} b) \wedge (a \sqsubseteq^b b)$
- Partial *preorder* on sets (not antisymmetric)
 - Every set equivalent to its convex-closure
- All operations are monotone w.r.t. (\sqsubseteq^{\natural})
- Satisfies no additional laws
 - Is the continuous free algebra satisfying powerdomain axioms

Outline

1 Motivation

- Introduction to Powerdomains
- Limitations of the List Monad for Nondeterminism

2 Properties of Powerdomains

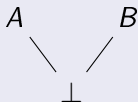
- Axiomatization of Powerdomains
- Powerdomain Orderings
- Visualizing Powerdomains

3 Formalization in Isabelle

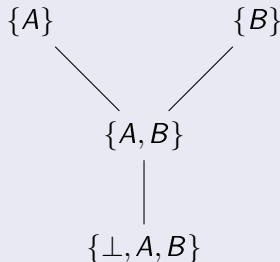
- Definition in Terms of Finite Elements
- Using Powerdomains in Isabelle

Powerdomains of Lifted 2-Element Type

Argument Type

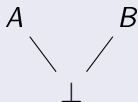


Upper Powerdomain

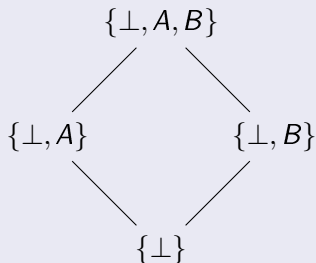


Powerdomains of Lifted 2-Element Type

Argument Type

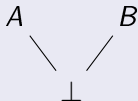


Lower Powerdomain

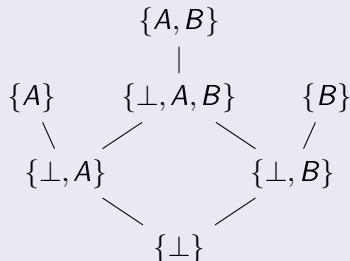


Powerdomains of Lifted 2-Element Type

Argument Type

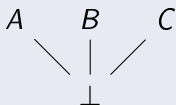


Convex Powerdomain

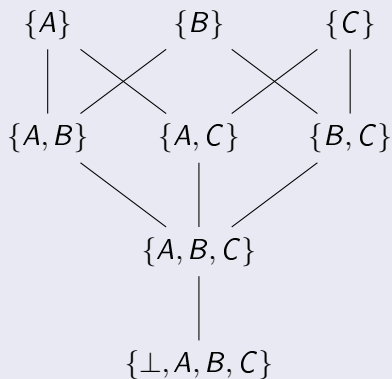


Powerdomains of Lifted 3-Element Type

Argument Type

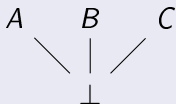


Upper Powerdomain

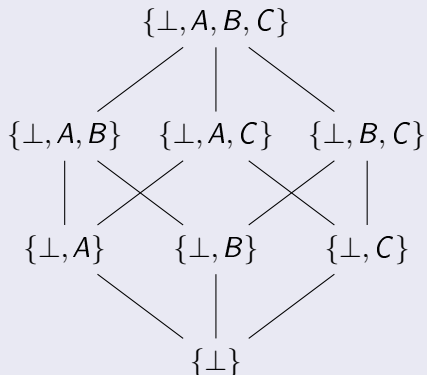


Powerdomains of Lifted 3-Element Type

Argument Type

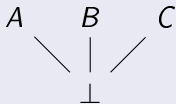


Lower Powerdomain

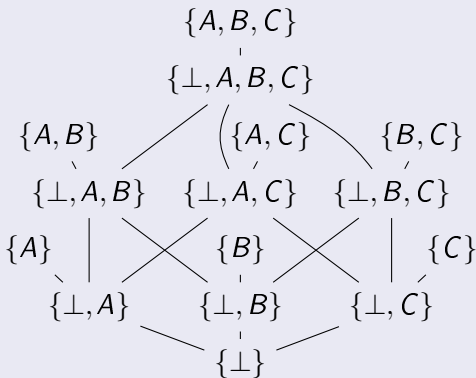


Powerdomains of Lifted 3-Element Type

Argument Type

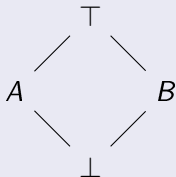


Convex Powerdomain

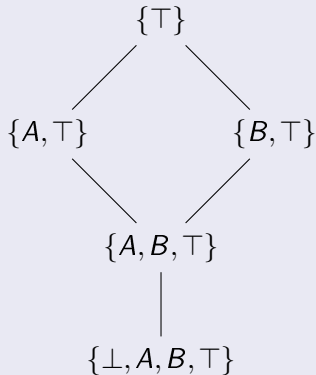


Powerdomains of 4-Element Lattice

Argument Type

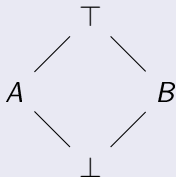


Upper Powerdomain

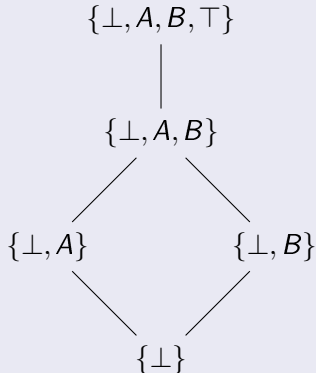


Powerdomains of 4-Element Lattice

Argument Type

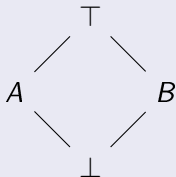


Lower Powerdomain

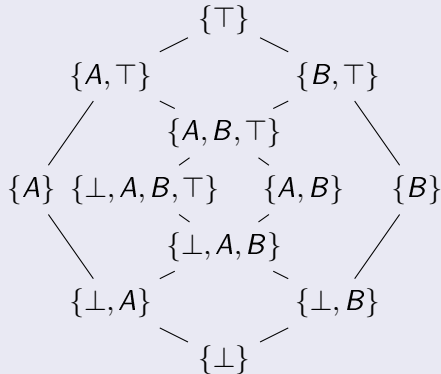


Powerdomains of 4-Element Lattice

Argument Type



Convex Powerdomain



Notes on Different Kinds of Powerdomains

- Upper

- $a \sqsubseteq b \iff a$ has *more* possible outcomes than b
- Union is strict: $\perp \cup a = \perp$
- “Possibly not terminating is just as bad as never terminating”
- Good for modeling total correctness

- Lower

- $a \sqsubseteq b \iff a$ has *fewer* possible outcomes than b
- Bottom is identity for union: $\perp \cup a = a$
- “I don’t care about execution paths that don’t terminate”
- Good for modeling partial correctness

- Convex

- Distinguishes more values than upper or lower
- Agnostic on total vs. partial correctness

Notes on Different Kinds of Powerdomains

- Upper

- $a \sqsubseteq b \iff a$ has *more* possible outcomes than b
- Union is strict: $\perp \cup a = \perp$
- “Possibly not terminating is just as bad as never terminating”
- Good for modeling total correctness

- Lower

- $a \sqsubseteq b \iff a$ has *fewer* possible outcomes than b
- Bottom is identity for union: $\perp \cup a = a$
- “I don’t care about execution paths that don’t terminate”
- Good for modeling partial correctness

- Convex

- Distinguishes more values than upper or lower
- Agnostic on total vs. partial correctness

Notes on Different Kinds of Powerdomains

- Upper

- $a \sqsubseteq b \iff a$ has *more* possible outcomes than b
- Union is strict: $\perp \cup a = \perp$
- “Possibly not terminating is just as bad as never terminating”
- Good for modeling total correctness

- Lower

- $a \sqsubseteq b \iff a$ has *fewer* possible outcomes than b
- Bottom is identity for union: $\perp \cup a = a$
- “I don’t care about execution paths that don’t terminate”
- Good for modeling partial correctness

- Convex

- Distinguishes more values than upper or lower
- Agnostic on total vs. partial correctness

Outline

1 Motivation

- Introduction to Powerdomains
- Limitations of the List Monad for Nondeterminism

2 Properties of Powerdomains

- Axiomatization of Powerdomains
- Powerdomain Orderings
- Visualizing Powerdomains

3 Formalization in Isabelle

- Definition in Terms of Finite Elements
- Using Powerdomains in Isabelle

What Sets Are Included in a Powerdomain?

A powerdomain type contains

- singletons
- binary unions
- limits of chains
- nothing else

Each powerdomain includes

- All finite nonempty sets
- Only those infinite sets needed for completeness

What Sets Are Included in a Powerdomain?

A powerdomain type contains

- singletons
- binary unions
- limits of chains
- nothing else

Each powerdomain includes

- All finite nonempty sets
- Only those infinite sets needed for completeness

What Sets Are Included in a Powerdomain?

A powerdomain type contains

- singletons
- binary unions
- limits of chains
- nothing else

Each powerdomain includes

- All finite nonempty sets
- Only those infinite sets needed for completeness

What Sets Are Included in a Powerdomain?

A powerdomain type contains

- singletons
- binary unions
- limits of chains
- nothing else

Each powerdomain includes

- All finite nonempty sets
- Only those infinite sets needed for completeness

What Sets Are Included in a Powerdomain?

A powerdomain type contains

- singletons
- binary unions
- limits of chains
- nothing else

Each powerdomain includes

- All finite nonempty sets
- Only those infinite sets needed for completeness

What Sets Are Included in a Powerdomain?

A powerdomain type contains

- singletons
- binary unions
- limits of chains
- nothing else

Each powerdomain includes

- All finite nonempty sets
- Only those infinite sets needed for completeness

Defining CPOs Using Ideal Completion

- Let (\preceq) be a reflexive, transitive relation
- An ideal A is a set that is
 - nonempty $(\exists x. x \in A)$
 - downward-closed $(\forall y \in A. \forall x \preceq y. x \in A)$
 - directed $(\forall x, y \in A. \exists z \in A. x \preceq z \wedge y \preceq z)$
- Principal ideals have a maximum element
 - $\{a \mid a \preceq x\}$ is the principal ideal generated by x
 - $x \preceq y$ implies $\{a \mid a \preceq x\} \subseteq \{a \mid a \preceq y\}$
- The set of ideals over (\preceq) is a CPO
 - The union of a chain of ideals is an ideal

Defining CPOs Using Ideal Completion

- Let (\preceq) be a reflexive, transitive relation
- An ideal A is a set that is
 - nonempty $(\exists x. x \in A)$
 - downward-closed $(\forall y \in A. \forall x \preceq y. x \in A)$
 - directed $(\forall x, y \in A. \exists z \in A. x \preceq z \wedge y \preceq z)$
- Principal ideals have a maximum element
 - $\{a \mid a \preceq x\}$ is the principal ideal generated by x
 - $x \preceq y$ implies $\{a \mid a \preceq x\} \subseteq \{a \mid a \preceq y\}$
- The set of ideals over (\preceq) is a CPO
 - The union of a chain of ideals is an ideal

Defining CPOs Using Ideal Completion

- Let (\preceq) be a reflexive, transitive relation
- An ideal A is a set that is
 - nonempty $(\exists x. x \in A)$
 - downward-closed $(\forall y \in A. \forall x \preceq y. x \in A)$
 - directed $(\forall x, y \in A. \exists z \in A. x \preceq z \wedge y \preceq z)$
- Principal ideals have a maximum element
 - $\{a \mid a \preceq x\}$ is the principal ideal generated by x
 - $x \preceq y$ implies $\{a \mid a \preceq x\} \subseteq \{a \mid a \preceq y\}$
- The set of ideals over (\preceq) is a CPO
 - The union of a chain of ideals is an ideal

Defining CPOs Using Ideal Completion

- Let (\preceq) be a reflexive, transitive relation
- An ideal A is a set that is
 - nonempty ($\exists x. x \in A$)
 - downward-closed ($\forall y \in A. \forall x \preceq y. x \in A$)
 - directed ($\forall x, y \in A. \exists z \in A. x \preceq z \wedge y \preceq z$)
- Principal ideals have a maximum element
 - $\{a \mid a \preceq x\}$ is the principal ideal generated by x
 - $x \preceq y$ implies $\{a \mid a \preceq x\} \subseteq \{a \mid a \preceq y\}$
- The set of ideals over (\preceq) is a CPO
 - The union of a chain of ideals is an ideal

Examples of Ideal Completion

Example

Naturals with (\leq) ordering

- (\leq) is not a complete ordering

In ideal completion

- Finite n represented by $\{a \mid a \leq n\}$
- Infinite value ω represented by \mathbb{N}

Examples of Ideal Completion

Example

Pairs of naturals with $(a, b) \preceq (c, d)$ iff $a \leq c$ and $b \leq d$

- Example: $(3, 5) \preceq (4, 7)$, but $(3, 5) \not\preceq (7, 4)$

In ideal completion

- Finite (m, n) represented by $\{(a, b) \mid a \leq m \wedge b \leq n\}$
- (ω, n) represented by $\{(a, b) \mid b \leq n\}$
- (ω, ω) represented by $\mathbb{N} \times \mathbb{N}$

Examples of Ideal Completion

Example

Lists with $xs \preceq ys$ iff xs is a prefix of ys

- Example: $(3,5) \preceq (4,7)$, but $(3,5) \not\preceq (7,4)$

In ideal completion

- Finite $[1,2,3]$ represented by $\{[], [1], [1,2], [1,2,3]\}$
- Infinite $[1,1,1\dots]$ represented by $\{xs \mid xs \text{ contains all } 1s\}$

What About Antisymmetry?

- (\preceq) does not need to be antisymmetric
- If x and y are equivalent w.r.t. (\preceq)
 - i.e. $x \preceq y$ and $y \preceq x$
 - then $\{a \mid a \preceq x\} = \{a \mid a \preceq y\}$
- Ideal completion handles equivalence classes automatically

Defining Powerdomains by Ideal Completion

- Define type constructor for nonempty finite sets
 - Basis of finite elements for powerdomains
- Define partial preorder relations (\sqsubseteq^\sharp) , (\sqsubseteq^b) , (\sqsubseteq^\flat)
 - All 3 powerdomains have the same abstract basis
- Define each powerdomain using ideal completion
 - Upper = Ideal(\sqsubseteq^\sharp)
 - Lower = Ideal(\sqsubseteq^b)
 - Convex = Ideal(\sqsubseteq^\flat)

Defining Continuous Functions on Ideal Completions

- Let f be a monotone function on an abstract basis
 - For all x and y , $x \preceq y$ implies $f(x) \sqsubseteq f(y)$
- There is a unique function g on the ideal completion such that
 - g is continuous
 - $g(\{a \mid a \preceq x\}) = f(x)$ for all x
- Function g is given by $g(A) = \bigsqcup_{x \in A} f(x)$
 - Proving that this limit exists is not easy!
- All powerdomain operations are defined using this method

Defining Continuous Functions on Ideal Completions

- Let f be a monotone function on an abstract basis
 - For all x and y , $x \preceq y$ implies $f(x) \sqsubseteq f(y)$
- There is a unique function g on the ideal completion such that
 - g is continuous
 - $g(\{a \mid a \preceq x\}) = f(x)$ for all x
- Function g is given by $g(A) = \bigsqcup_{x \in A} f(x)$
 - Proving that this limit exists is not easy!
- All powerdomain operations are defined using this method

Defining Continuous Functions on Ideal Completions

- Let f be a monotone function on an abstract basis
 - For all x and y , $x \preceq y$ implies $f(x) \sqsubseteq f(y)$
- There is a unique function g on the ideal completion such that
 - g is continuous
 - $g(\{a \mid a \preceq x\}) = f(x)$ for all x
- Function g is given by $g(A) = \bigsqcup_{x \in A} f(x)$
 - Proving that this limit exists is not easy!
- All powerdomain operations are defined using this method

Defining Continuous Functions on Ideal Completions

- Let f be a monotone function on an abstract basis
 - For all x and y , $x \preceq y$ implies $f(x) \sqsubseteq f(y)$
- There is a unique function g on the ideal completion such that
 - g is continuous
 - $g(\{a \mid a \preceq x\}) = f(x)$ for all x
- Function g is given by $g(A) = \bigsqcup_{x \in A} f(x)$
 - Proving that this limit exists is not easy!
- All powerdomain operations are defined using this method

Outline

1 Motivation

- Introduction to Powerdomains
- Limitations of the List Monad for Nondeterminism

2 Properties of Powerdomains

- Axiomatization of Powerdomains
- Powerdomain Orderings
- Visualizing Powerdomains

3 Formalization in Isabelle

- Definition in Terms of Finite Elements
- Using Powerdomains in Isabelle

Integration with Axiomatic Constructor Classes

- Axiomatic Constructor Classes in Isabelle/HOLCF
 - Joint work with John Matthews & Peter White, 2005
 - Formalized axiomatic classes for Functor and Monad
 - Defined resumption monad transformer
- Now extended to support powerdomains
 - Axiomatic class for powerdomains
 - Powerdomain operations use overloaded syntax
 - Can apply resumption monad transformer to powerdomains

Example Proofs in Isabelle

- The Haskell examples shown earlier have been formalized
 - With powerdomains, the properties are actually true!
- See it in action

Summary

- Powerdomains are well-suited for reasoning about nondeterminism in functional programs.
- You can do proofs about powerdomains right now in Isabelle/HOLCF.
- Future work
 - Proofs about parallel code, using monad transformers.