- Functional Programming 101
  - Short intro
  - Monads
  - Arrows
- Parallel Arrows
  - Introduction to Parallelism
  - Generalization to Arrows
  - ArrowParallel Implementations
- Usability
  - Skeletons
  - Syntactic Sugar
- Benchmarks



- 1 Functional Programming 101
  - Short intro
  - Monads
  - Arrows
- Parallel Arrows
  - Introduction to Parallelism
  - Generalization to Arrows
  - ArrowParallel Implementations
- 3 Usability
  - Skeletons
  - Syntactic Sugar
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#### **Functions**

Short intro

```
public static int fib(int x) {
    if (x<=0)
      return 0;
    else if (x==1)
      return 1;
    else
    return fib(x-2) + fib(x-1);
    }</pre>
```

```
fib :: Int -> Int

fib x

| x <= 0 = 0
| x == 1 = 0
| otherwise =

(fib (x - 2))

(fib (x - 1))
```

- Functional programming equally powerful as imperative programming
- focused on the "what?" instead of the "how?"
   ⇒ more concise ⇒ easier to reason about
- based on Lambda Calculus

### Monad Definition

```
class Monad m where
```

$$(>>=) :: m a -> (a -> m b) -> m b$$

 $return :: a \rightarrow m a$ 

#### Similar to Java's Optional, we have Maybe a:

instance Monad Maybe where

$$_2$$
 (Just a)  $>>= f = f a$ 

$$|$$
 Nothing  $>>=$   $_{-}=$  Nothing

$$return a = Just a$$

⇒ composable computation descriptions

### Monad Usage

#### With monadic functions like

```
1 func :: Int -> Maybe Int
 func x
   | \times < 0 = Nothing
     otherwise = Just (x * 2)
```

#### we can compose computations:

```
_{1} | complicatedFunc :: Int -> Maybe Int
 complicatedFunc x = (\mathbf{return} \ x) >>= func >>= ...
```

## Arrow Definition (1)

Arrows

Another way to compose computations are arrows:



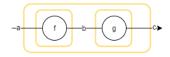
### Arrow Definition (2)

## class Arrow arr where arr :: (a -> b) -> arr a b

$$(>>>)$$
 :: arr a b  $->$  arr b c  $->$  arr a c

first :: arr a b -> arr (a,c) (b,c)







### $\mathsf{Functions} \in \mathsf{Arrows}$

Arrows

### Functions (->) are arrows:

```
instance Arrow (->) where

arr f = f

f >>> g = g . f

first f = \((a, c) -> (f a, c)
```

## The Kleisli Type

Arrows

#### The Kleisli type

```
_{1}\Big|\operatorname{\mathbf{data}} Kleisli m a b = Kleisli \{ \ \operatorname{\mathsf{run}} \ :: \ \operatorname{\mathsf{a}} \ -> \operatorname{\mathsf{m}} \ \operatorname{\mathsf{b}} \ \}
```

#### is also an arrow:

```
instance Monad m => Arrow (Kleisli m) where

arr f = Kleisli $ return . f

f >>> g = Kleisli $ a -> f a >>= g

first f = Kleisli $ a -> f a >>= b -> f a -> f
```

Arrows

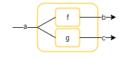
|second :: arr a b -> arr (c, a) (c, b)second f = arr swap >>>first f >>> arr swap where swap (x, y) = (y, x)



 $_{1}|(***)$  :: arr a b -> arr c d ->arr (a, c) (b, d)  $g \mid f *** g = first f >>> second g$ 



 $_{1}|(\&\&\&):: arr a b -> arr a c ->$ arr a (b, c) | f &&& g = arr (a -> (a, a)) >>>(f \*\*\* g)

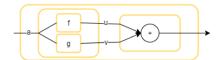


### Arrow Example

Arrows

#### Arrow usage example:

```
add :: Arrow arr => arr a \mathbf{Int} -> arr a \mathbf{Int} -> arr a \mathbf{Int} add f g = (f &&& g) >>> arr (\((u, v) -> u + v)
```



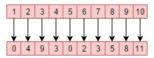
- 1 Functional Programming 101
  - Short intro
  - Monads
  - Arrows
- Parallel Arrows
  - Introduction to Parallelism
  - Generalization to Arrows
  - ArrowParallel Implementations
- 3 Usability
  - Skeletons
  - Syntactic Sugar
- 4 Benchmarks



References

In general, Parallelism can be looked at as:

$$_{1}$$
 parEvalN :: [a  $->$  b]  $->$  [a]  $->$  [b]



$$|\mathbf{a}|$$
 parEvalN ::  $[\mathbf{a} -> \mathbf{b}] -> [\mathbf{a}] -> [\mathbf{b}]$ 

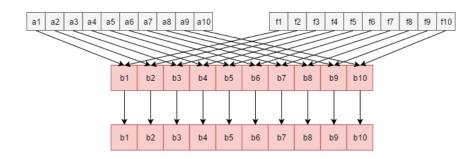
#### Roadmap:

- Implement using existing Haskells
  - Multicore
  - ParMonad
  - Eden
- Generalize to Arrows
- Adapt Implementations
- Profit

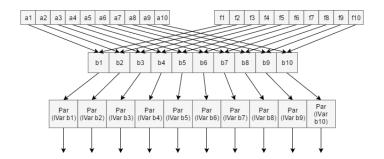
Introduction to Parallelism

### Multicore Haskell

```
parEvalN :: (NFData b) => [a -> b] -> [a] -> [b] parEvalN fs as = zipWith ($) fs as 'using' parList rdeepseq
```

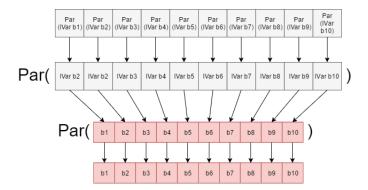


```
parEvalN :: (NFData b) => [a -> b] -> [a] -> [b]
 parEvalN fs as = runPar $
   (sequence $ map (spawnP) $ zipWith ($) fs as) >>= mapM get
3
```

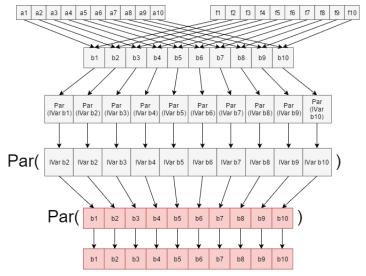


### ParMonad

```
\begin{array}{l} \tiny parEvalN :: (NFData \ b) => [a \ -> b] \ -> [a] \ -> [b] \\ \tiny parEvalN \ fs \ as = runPar \ \$ \\ \tiny (sequence \$ map \ (spawnP) \$ zipWith \ (\$) \ fs \ as) >>= mapM \ get \end{array}
```



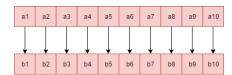
### ParMonad



Introduction to Parallelism

### Eden

parEvalN :: (Trans a, Trans b) => [a -> b] -> [a] -> [b]parEvalN fs as = spawnF fs as



#### Now, let's generalize:

$$|a|$$
 parEvalN ::  $[a -> b] -> [a] -> [b]$ 

### Now, let's generalize:

parEvalN :: 
$$[a \rightarrow b] \rightarrow [a] \rightarrow [b]$$

$$|a|$$
 parEvalN :: (Arrow arr) => [arr a b] -> arr [a] [b]

#### Now, let's generalize:

$$|a|$$
 parEvalN ::  $[a \rightarrow b] \rightarrow [a] \rightarrow [b]$ 

$$|a|$$
 parEvalN :: (Arrow arr) => [arr a b] -> arr [a] [b]



### The ArrowParallel typeclass

#### Now, let's generalize:

$$_{1}$$
 parEvalN :: [a  $->$  b]  $->$  [a]  $->$  [b]

$$|a|$$
 parEvalN :: (Arrow arr) => [arr a b] -> arr [a] [b]

class Arrow arr => ArrowParallel arr a b where parEvalN :: [arr a b] -> arr [a] [b]

```
class Arrow arr => ArrowParallel arr a b conf where
  parEvalN :: conf -> [arr a b] -> arr [a] [b]
```

Usability

#### Multicore

```
| instance (NFData b, ArrowApply arr, ArrowChoice arr) =>
    ArrowParallel arr a b conf where
2
     parEvalN _ fs = listApp fs >>>
       arr (flip using $ parList rdeepseg)
```

```
listApp :: (ArrowChoice arr, ArrowApply arr) => [arr a b] -> arr [a] [b]
(>>>) :: arr a b -> arr b c -> arr a c
arr :: Arrow arr =>(a -> b) -> arr a b
flip :: (a -> b -> c) -> b -> a -> c
using :: a \rightarrow Strategy a \rightarrow a
(\$) :: (a -> b) -> a -> b
parList :: Strategy a -> Strategy [a]
rdeepseg :: NFData a =>Strategy a
```

#### ParMonad<sub>i</sub>

```
instance (NFData b, ArrowApply arr, ArrowChoice arr) =>
ArrowParallel arr a b conf where

parEvalN _ fs =
    (arr $ \as -> (fs, as)) >>>
    zipWithArr (app >>> arr spawnP) >>>
    arr sequence >>>
    arr (>>= mapM get) >>>
    arr runPar
```

```
arr :: Arrow arr =>(a -> b) -> arr a b zipWithArr :: ArrowChoice arr =>arr (a, b) c -> arr ([a], [b]) [c] app :: ArrowApply arr =>(arr a b, a) b spawnP :: NFData a =>a -> Par (IVar a) sequence :: (Monad m) =>[m a] -> m [a] (>>=) :: m a -> (a -> m b) -> m b
```

### Eden (1)

For Eden we need separate implementations, for Functions:

instance (Trans a, Trans b) => ArrowParallel (->) a b conf where parEvalN \_ fs as = spawnF fs as

spawnF :: (Trans a, Trans b) 
$$=>$$
[a  $->$  b]  $->$  [a]  $->$  [b]

### Eden (2)

#### and the Kleisli type:

```
instance (Monad m, Trans a, Trans b, Trans (m b)) =>
ArrowParallel ( Kleisli m) a b conf where
parEvalN conf fs =
(arr $ parEvalN conf (map (\((Kleisli f) -> f) fs)) >>>
( Kleisli $ sequence)
```

```
arr :: (Arrow arr) =>(a -> b) -> arr a b map :: (a -> b) -> [a] -> [b] sequence :: (Monad m) =>[m a] -> m [a]
```

### Eden (3)

This is because of spawnF's signature:

$$||$$
 spawnF :: (Trans a, Trans b)  $=>$  [a  $->$  b]  $->$  [a]  $->$  [b]

and app's signature:

$$|app :: (ArrowApply arr) => arr (arr a b, a) b$$

### Eden (3)

This is because of spawnF's signature:

$$|| spawnF :: (Trans a, Trans b) => [a -> b] -> [a] -> [b]$$

and app's signature:

$$|app :: (ArrowApply arr) => arr (arr a b, a) b$$

Hacky alternative:

$$_{1}$$
 class (Arrow arr) => ArrowUnwrap arr where

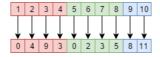
arr a b 
$$->$$
 (a  $->$  b)

- Functional Programming 101
  - Short intro
  - Monads
  - Arrows
- 2 Parallel Arrows
  - Introduction to Parallelism
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  - Syntactic Sugar
- 4 Benchmarks



#### parEvalN, but **chunky**:

|a| parEvalNLazy :: conf -> ChunkSize -> [arr a b] -> (arr [a] [b])



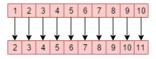
#### parallel evaluation of different typed functions:

|a| parEval2 :: conf -> arr a b -> arr c d -> (arr (a, c) (b, d))



#### map, but in parallel:

parMap :: conf -> (arr a b) -> (arr [a] [b])



#### parMap, but **chunky**:

||parMapStream| :: conf -> ChunkSize -> arr a b -> arr [a] [b]



# Skeletons... (3)

#### parMap, but with workload distribution:

|| farm :: conf -> NumCores -> arr a b -> arr [a] [b]

#### farm, but chunky:

1 farmChunk ::

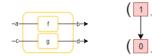
2

conf -> ChunkSize -> NumCores -> arr a b-> arr [a] [b]

$$\begin{array}{c}
1 \\
(|>>>|) :: (Arrow arr) => [arr a b] -> [arr b c] -> [arr a c] \\
2 \\
(|>>>|) = zipWith (>>>)
\end{array}$$

#### On all Elements:

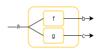






Syntactic Sugar

```
 \begin{array}{l} \text{(|\&\&\&|) :: (Arrow arr, ...) =>} \\ \text{arr a b } -> \text{arr a c } -> \text{arr a (b, c)} \\ \text{(|\&\&\&|) f g = (arr $$ $\a -> (a, a)) >>> f $|***|$ g}
```

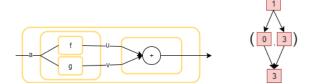




### Parallelism as an operator

#### Parallel Evaluation made easy:

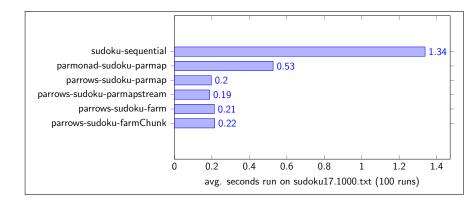
```
_{1} add :: Arrow arr => arr a Int -> arr a Int -> arr a Int
 add f g = (f |\&\&\&| g) >>> arr (\(u, v) -> u + v)
```

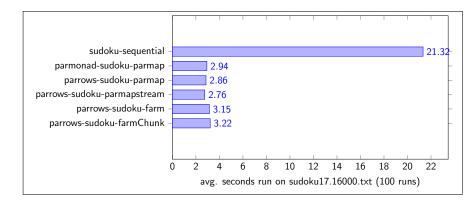


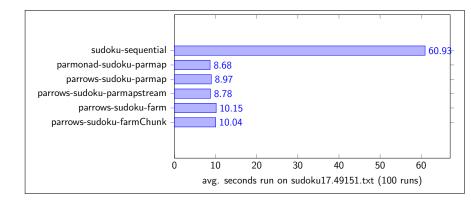
- Functional Programming 101
  - Short intro
  - Monads
  - Arrows
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- Run on: Core i7-3970X CPU @ 3.5GHz / 6C/12T.
- compiled with ParMonad backend
- used Sudoku Benchmark from ParMonad examples







- - Short intro
  - Monads

Functional Programming 101

- Arrows
- - Introduction to Parallelism
  - Generalization to Arrows
  - ArrowParallel Implementations
- - Skeletons
  - Syntactic Sugar