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

Benchmarks

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Functions

```
public static int fib(int x) {
    if (x < = 0)
     return 0:
   else if (x==1)
4
      return 1;
   else
     return fib(x-2) + fib(x-1);
7
8
```

```
fib :: Int \rightarrow 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?" \Rightarrow more concise \Rightarrow easier to reason about
- based on Lambda Calculus

Arrow Definition (1)

Arrows

Another way to think about computations:



Arrow Definition (2)

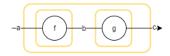
class Arrow arr where

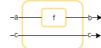
$$\mathsf{arr} \ :: \ \big(\mathsf{a} \ -\!\!> \mathsf{b}\big) -\!\!\!> \mathsf{arr} \ \mathsf{a} \ \mathsf{b}$$

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

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







Functions \in 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 { run :: a -> m b }
```

is also an arrow:

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

arr f = Kleisli $ return . f

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

first f = Kleisli $ \ackslash (a,c) -> f a >>= \b -> return (b,c)
```

Arrows

Combinators (1)

```
second :: arr a b \rightarrow arr (c, a) (c, b)
second f = arr swap >>
first f >> arr swap
where swap (x, y) = (y, x)
```



```
\begin{bmatrix} 1 \\ 2 \end{bmatrix} (***) :: \text{ arr a b } -> \text{ arr c d } -> \text{ arr (a, c) (b, d)}
\begin{bmatrix} 1 \\ 2 \end{bmatrix} f *** g = \text{ first } f >>> \text{ second g}
```





Combinators (2)

Arrows

$$\begin{bmatrix} 1 \\ 2 \end{bmatrix}$$
 (&&&) :: arr a b -> arr a c -> arr a (b, c) $\begin{bmatrix} 1 \\ 2 \end{bmatrix}$ f &&& g = arr (\alpha -> (a, a)) >>> (f *** g)

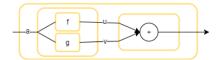


Arrow Example

Arrows

Arrow usage example:

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

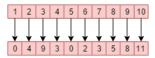


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In general, Parallelism can be looked at as:

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



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

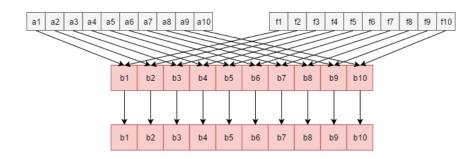
Roadmap:

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

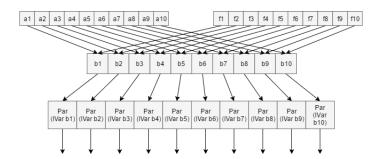
Introduction to Parallelism

Multicore Haskell

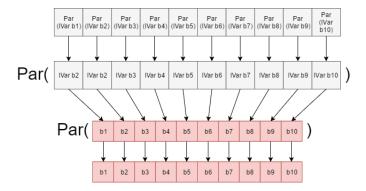
```
parEvalN :: (NFData b) => [a -> b] -> [a] -> [b] parEvalN fs as = \mathbf{zipWith} ($) fs as 'using' parList rdeepseq
```



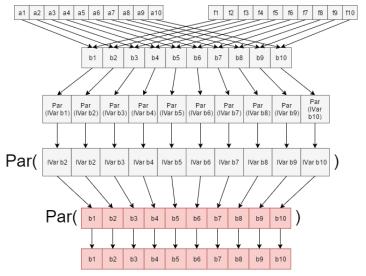
parEvalN :: (NFData b) =>
$$[a -> b] -> [a] -> [b]$$
parEvalN fs as = runPar \$
(sequence \$ map (spawnP) \$ zipWith (\$) fs as) >>= mapM get



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

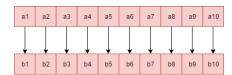


ParMonad



Eden

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



The ArrowParallel typeclass

Now, let's generalize:

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

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

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

Now, let's generalize:

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

$$|\mathbf{a}|$$
 parEvalN :: (Arrow arr) => [arr a b] -> arr [a] [b]

class Arrow arr => ArrowParallel arr a b where

parEvalN :: [arr a b] -> arr [a] [b]

The ArrowParallel typeclass

Now, let's generalize:

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

$$|\mathbf{a}|$$
 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]
```

ArrowParallel Implementations

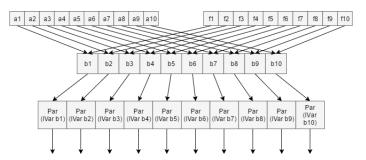
Multicore

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

```
a2
         a3
                  a5
                       a6
                            а7
                                 а8
                                     a9 a10
                                                                  f2
                                                                       f3
                                                                           f4
                                                                                     f6
                                                                                                       f10
a1
             a4
                      b1
                            b2
                                   b3
                                          b4
                                                 b5
                                                       b6
                                                              b7
                                                                    h8
                                                                           b9
                                                                                 b10
                      b1
                            b2
                                   b3
                                          b4
                                                 b5
                                                       b6
                                                              b7
                                                                    b8
                                                                           h9
                                                                                 b10
```

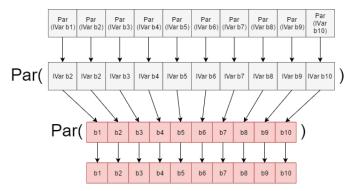
ParMonad

```
instance (NFData b, ArrowApply arr, ArrowChoice arr) =>
ArrowParallel arr a b conf where
parEvalN _ fs =
    (arr $ \as -> (fs, as)) >>>
    zipWithArr (app >>> arr spawnP) >>>
    ...
```



ParMonad

```
1 ...
2 arr sequence >>>
3 arr (>>= mapM get) >>>
4 arr runPar
```



Eden (1)

For Eden we need separate implementations.

This is because of spawnF's

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

and app's signature

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

which don't fit together.

ArrowParallel Implementations

For Eden we need separate implementations.

This is because of spawnF's

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

and app's signature

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

which don't fit together.

Hacky alternative:

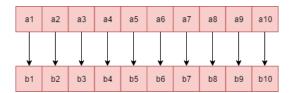
class (Arrow arr) => ArrowUnwrap arr where

$$|a|$$
 arr $|a|$ $|b|$ $->$ $|a|$

Eden (2)

Implementation for Functions

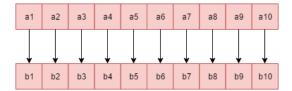
instance (Trans a, Trans b) => ArrowParallel (->) a b conf where parEvalN $_{-}$ fs as = spawnF fs as



Eden (3)

Implementation for 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)
```



Benchmarks

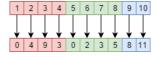
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Skeletons... (1)

Skeletons

parEvalN, but chunky:

parEvalNLazy :: conf \rightarrow ChunkSize \rightarrow [arr a b] \rightarrow (arr [a] [b])



parallel evaluation of different typed functions:

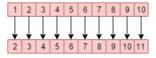
 $|\mathbf{parEval2}|$:: conf -> arr a b -> arr c d -> (arr (a, c) (b, d))



Skeletons... (2)

map, but in parallel:

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



parMap, but **chunky**:

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

Skeletons... (3)

Skeletons

parMap, but with workload distribution:

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

farm, but chunky:

1 farmChunk ::

2

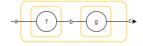
conf -> ChunkSize -> NumCores -> arr a b-> arr [a] [b]



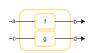
Parallel Operators (1)

$$\begin{array}{c} \left(|>>>| \right) :: \left[\mathsf{arr} \ \mathsf{a} \ \mathsf{b} \right] \ -> \left[\mathsf{arr} \ \mathsf{b} \ \mathsf{c} \right] \ -> \left[\mathsf{arr} \ \mathsf{a} \ \mathsf{c} \right] \\ \left(|>>>| \right) = \mathbf{zipWith} \ (>>>) \end{array}$$

On all Elements:

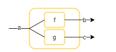


```
(|***|) :: arr a b -> arr c d -> arr (a, c) (b, d)
(|***|) = parEval2()
```





Parallel Operators (2)

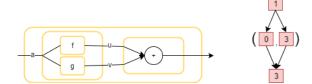




Parallelism made easy

Parallel Evaluation made easy:

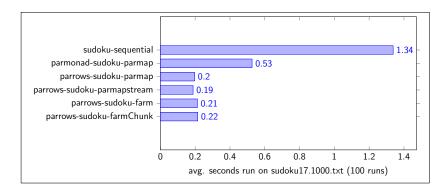
add :: Arrow arr => arr a
$$Int$$
 -> arr a Int -> arr a Int add f g = (f $|\&\&\&|$ g) >>> arr (\((u, v) -> u + v)

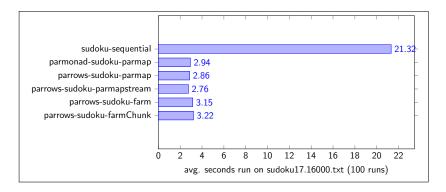


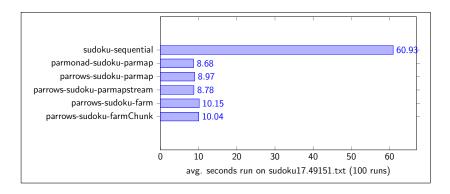
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- Run on: Core i7-3970X CPU @ 3.5GHz / 6C/12T
- compiled with ParMonad backend
- used Sudoku Benchmark from ParMonad examples







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