## High-level Synthesis from Functional Languages

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# $(\lambda x.?)f = FPGA$

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# Parallelism is the Big Question



# Parallelism is the Big Question



# Massive On-Chip Parallelism is Inevitable



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Intel's 48-core "Single Chip Cloud Computer"

# The Future is Wires and Memory







## The Future is Already Here



Altera Stratix IV FPGA

## The Memory Hierarchy is the Interesting Part



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# The Big Question

#### How Do Algorithms Manipulate Data?



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#### How Do Algorithms Manipulate Data?

#### We will only be able to answer this in very disciplined languages.

#### E.g., pure functional languages with immutable data structures



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# Why Functional Specifications?

- Referential transparency/side-effect freedom make formal reasoning about programs vastly easier
- Inherently concurrent and race-free (Thank Church and Rosser). If you want races and deadlocks, you need to add constructs.
- Immutable data structures makes it vastly easier to reason about memory in the presence of concurrency



# Multiprocessor Memory is a Headache

- Cache Coherency
- Write buffers
- Sequential Memory Consistency
- Memory barriers
- Data Races
- Atomic operations

Immutable data structures simplify these



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# I Don't Think We Want Laziness

#### Laziness has certain semantic advantages, but the bookkeeping is probably not worth it



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# Approach

- We do not know the structure of future memory systems Homogeneous/Heterogeneous? Levels of Hierarchy? Communication Mechanisms?
- We do not know the architecture of future multi-cores Programmable in Assembly/C? Single- or multi-threaded?

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Use FPGAs as a surrogate. Ultimately too flexible, but representative of the long-term solution.

## The Big Question'

How do we synthesize hardware from pure functional languages for FPGAs?

Control and datapath are easy; the memory system is interesting.

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# To Implement Real Algorithms in Hardware, We Need

Structured, recursive data types

#### Recursion to handle recursive data types

Memories

Memory Hierarchy











Example: Huffman Decoder in Haskell

data HTree = Branch HTree HTree | Leaf Char

decode :: HTree -> [Bool] -> [Char] -- Huffman tree & bitstream to symbols

decode table str = decoder table strwhere decoder (Leaf s) i = s: (decoder table i) -- Identified symbol; start again  $decoder_{[]} = []$  decoder (Branch  $f_{-}$ ) (False:xs) = decoder f xs -- 0: follow left branch decoder (Branch  $_{-}$ t) (True:xs) = decoder t xs -- 1: follow right branch

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Three data types: Input bitstream, output character stream, and Huffman tree

# One Way to Encode the Types

#### Huffman tree nodes: (19 bits)

0	8-bit character	(unused)	Leaf Char
1	9-bit tree ptr.	9-bit tree ptr.	Branch Tree Tree

#### Boolean input stream: (10 bits)

0	(unused)		Nil
1	bit	8-bit tail pointer	Cons Bool List

#### Character output stream: (19 bits)

0	(unused)		Nil
1	8-bit character	10-bit tail pointer	Cons Char List

# Intermediate Representation Desiderata

Mathematical formalism convenient for performing "parallelizing" transformations, a.k.a. parallel design patterns

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- Pipeline
- Speculation
- Multiple workers
- Map-reduce

## Intermediate Representation: Recursive "Islands"

```
program ::= island*
  island ::= island name arg<sup>*</sup> = expr state<sup>*</sup> Group of states w/ stack
    state ::= label arg^* = expr
                                                    Arguments & expression
    expr ::= name var^*
                                                    Apply a function
             let (var = expr)^+ in expr
                                                    Parallel evaluation
             case var of (pattern \rightarrow expr)^+
                                                    Multiway conditional
              var
             literal
             recurse label var<sup>*</sup> (var<sup>*</sup>)
                                                    Explicit continuation
             return var
             goto label var*
                                                    Branch to another state
 pattern ::= name var* | literal | _
                                                    Constructor/literal/def.
```

#### Huffman as a Recursive Island

data HTree = Branch HTree HTree | Leaf Char

*decode* :: *HTree* -> [**Bool**] -> [**Char**]

decode table str = decoder table str where

```
decoder (Leaf s) i =
    s : (decoder table i)
decoder_[] = []
decoder (Branch f_) (False:xs) =
    decoder f xs
decoder (Branch_t) (True:xs) =
    decoder t xs
```

island decoder treep ip =
 let r = dec treep treep ip in return r

island dec treep statep ip =
let i = fetchi ip
state = fetcht statep in
case state of
Leaf a -> recurse s1 a (treep treep ip)
Branch f t ->
case i of
Nil -> let np = Nil in return np
Cons x xsp ->
case x of
True -> goto dec treep t xsp
False -> goto dec treep f xsp

s1 a rp = **let** rrp = Cons a rp **in return** rrp

# The Basic Translation Template



Strobe-based interface: *go* indicates inputs are valid; *ready* pulses once when result is valid.

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## Translating Let and Case



Let makes new values available to an expression.



Case invokes one of its sub-expressions, then synchronizes.

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# Translating an Island



Each island consists of expressions for each state, its own stack, and a controller that manages the stack and invokes the states.

## **Constructors and Memory**

A constructor is a function that stores data in memory.

constructor  $\alpha :: \alpha \to Ptr \alpha$ 

Memory access functions turn pointers into data.

fetch  $\alpha$  :: Ptr  $\alpha \rightarrow \alpha$ 

Memory stores return an address, not take one as an argument

Constructor is responsible for memory management.

By default, each data type gets its own memory.

**Duplication for Performance** 

$$\begin{array}{l} fib \ 0 = 0 \\ fib \ 1 = 1 \\ fib \ n = fib \ (n-1) + fib \ (n-2) \end{array}$$

## **Duplication for Performance**

$$\begin{array}{l} fib \ 0 = 0 \\ fib \ 1 = 1 \\ fib \ n = fib \ (n-1) + fib \ (n-2) \end{array}$$

After duplicating functions:

$$\begin{array}{l} fib' \ 0 = 0 \\ fib' \ 1 = 1 \\ fib' \ n = fib' \ (n-1) + fib' \ (n-2) \end{array}$$

$$\begin{array}{ll} fib'' & 0 = 0 \\ fib'' & 1 = 1 \\ fib'' & n = fib'' & (n-1) + fib'' & (n-2) \end{array}$$

Here, *fib*' and *fib*" may run in parallel.

## **Unrolling Recursive Data Structures**

Like a "blocking factor," but more general. Idea is to create larger memory blocks that can be operated on in parallel.

Original Huffman tree type:

data Htree = Branch Htree HTree | Leaf Char

Unrolled Huffman tree type:

data Htree = Branch Htree' HTree' | Leaf Char data Htree' = Branch' Htree'' HTree'' | Leaf Char data Htree'' = Branch'' Htree HTree | Leaf' Char

Recursive instances must be pointers; others can be explicit.

Functions must be similarly modified to work with the new types.

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