

# The Burden of Exascale

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# A Glimmer of Hope

"The next generation, called **exaflop computers**, would be capable of ...

Once thought to be just 5 or 10 years away, they now seem nearly impossible."

Superconductor Logic goes Low power

IEEE Spectrum, July 2011 (This Month), P. 18

# From Petascale to Exascale

## More of the same, with finer resolution

- Climate modeling, Computational biology, Code breaking, ...
- Speculative execution
- Robust computing: Computation logging/monitoring, Encrypted Computing
- Machine learning: Question answering/ Report writing
- Simulations

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I don't see an Exascale programming problem

, different from Petascale, Terascale, Gigascale ....

# Ascale programming

The key defining characteristic is **concurrency** in control and data.

# Concurrency

- Express concurrency explicitly or implicitly.
- Succinct representation of concurrency  
Can not enumerate threads.
- Structured Concurrency  
Fractal concurrency (Cook) for resource allocation

# Static vs. Dynamic Concurrency

- Static concurrency:  
Typically **synchronous** parallelism. Limited range of problems.
- Dynamic concurrency:  
Typically **asynchronous** parallelism. Includes sequencing.

# Kinds of Problems in Synchronous Parallelism

- Fast Fourier Transform
- Batcher Sort
- Ladner-Fischer Prefix sum
- Odd-Even Reductions of tridiagonal Linear Systems
- Descriptions of Recursive Connection Structures



# Typical Strategy in Programming Synchronous Parallelism

- Parameterize solution by the size of the network
- Specify data movement (playing with indices)
- Specify computation at each node

Instead ...

# A data structure for synchronous parallelism

- **Powerlist**: A list of  $2^n$  items,  $n \geq 0$ .
- Smallest powerlist has a single item,  $\langle x \rangle$ .
- For powerlists  $p$  and  $q$  of the same length:
  - (tie)  $p \mid q$ :  $p$  concatenated with  $q$ ,
  - (zip)  $p \bowtie q$ : interleave items from  $p$  and  $q$ , starting with  $p$ .

$$\langle 0 \ 1 \rangle \mid \langle 2 \ 3 \rangle = \langle 0 \ 1 \ 2 \ 3 \rangle, \quad \langle 0 \ 1 \rangle \bowtie \langle 2 \ 3 \rangle = \langle 0 \ 2 \ 1 \ 3 \rangle$$

## Example of a Powerlist Function: Reverse

$$\text{rev}\langle a\ b\ c\ d\rangle = \langle d\ c\ b\ a\rangle$$

Definition of Reverse:

$$\text{rev}\langle x\rangle = \langle x\rangle$$

$$\text{rev}(p \mid q) = (\text{rev } q) \mid (\text{rev } p)$$

Properties:

$$\text{rev}(p \bowtie q) = (\text{rev } q) \bowtie (\text{rev } p)$$

$$\text{rev}(\text{rev } p) = p$$

# Rotate Right and Rotate Left

$$rr\langle a\ b\ c\ d\rangle = \langle d\ a\ b\ c\rangle$$

$$rl\langle a\ b\ c\ d\rangle = \langle b\ c\ d\ a\rangle$$

$$rr\langle x\rangle = \langle x\rangle, \quad rr(u \bowtie v) = (rr\ v) \bowtie u$$

$$rl\langle x\rangle = \langle x\rangle, \quad rl(u \bowtie v) = v \bowtie (rl\ u)$$

Properties:

$$rr(rl\ p) = p$$

$$rev(rr(rev(rr\ p))) = p$$

# Permutatation Function *inv*

$$\begin{array}{cccccccc}
 & 000 & 001 & 010 & 011 & 100 & 101 & 110 & 111 \\
 \textit{inv} \langle & a & b & c & d & e & f & g & h & \rangle \\
 \langle & a & e & c & g & b & f & d & h & \rangle
 \end{array} =$$

$$\textit{inv} \langle x \rangle = \langle x \rangle$$

$$\textit{inv}(p \mid q) = (\textit{inv} p) \bowtie (\textit{inv} q)$$

Duality Property:

$$\textit{inv}(p \bowtie q) = (\textit{inv} p) \mid (\textit{inv} q)$$

# Fast Fourier Transform: Algorithm

$$\textcolor{red}{FFT}\langle x \rangle = \langle x \rangle$$

$$\textcolor{red}{FFT}(u \bowtie v) = (U + V \times W) \mid (U - V \times W)$$

where

$$U = \textcolor{red}{FFT} u$$

$$V = \textcolor{red}{FFT} v$$

$$W = \langle \omega^0 \omega^1 \dots \rangle$$

# Message

- Implicit thread creation, manipulation
- Description is well-suited for hypercubic computation
- Narrow range of applicability

# Asynchronous Parallelism

- General purpose computing with high-levels of concurrency
- Irregular problem structure (unlike synchronous parallelism)
- Thread creation, interruption, failure ... at very large scale
- Interaction with other agents, possibly in real time

**Example:** Map-Reduce has some of these characteristics.



# What we are unable to do well

- Explicitly manage threads
- Explicitly assign threads to resources
- Explicitly specify data migration
- Explicitly integrate concurrent and sequential computing

# Algebraic Approach: Orc Calculus

- Structured Concurrency
- Hierarchy, Recursion
- Implicit thread creation and manipulation

# Orc Basics

- **Site**: Basic service or component. The value returned by a site is **published**.
  - add two numbers
  - decompress file
  - send an email
  - a database
  - discover a site, create a site
  - treat humans as sites
  - sites may fail
- Concurrency **combinators** for integrating sites.

## Orc Basics; Contd.

- Theory includes nothing except the combinators.
- No notion of data type, thread, process, channel, storage, synchronization, ...
- New concepts are programmed using new sites.

# Orc Calculus

- **Simple** Expression: just a site call,  $CNN(d)$   
Publishes the value returned by the site.

- **Composition** of two Orc expressions:

do  $f$  and  $g$  in parallel

$f \mid g$

Symmetric composition

for all  $x$  from  $f$  do  $g$

$f > x > g$

Sequential composition

for some  $x$  from  $g$  do  $f$

$f < x < g$

Pruning

if  $f$  halts without publishing do  $g$

$f ; g$

Otherwise

- **Definitions**

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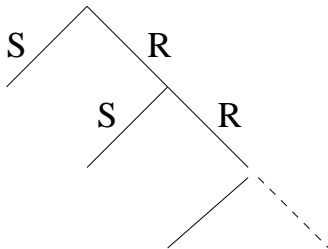
- **Definitions**

## Example of a Definition: Metronome

Publish a signal every unit.

*def* *Metronome*() = *signal* | ( *Rwait*(1) *>>* *Metronome*() )

*S* *R*



# Orc language

- Adds syntactic sugar to Orc calculus
- Translated to pure Orc calculus  
All arguments in a site call are evaluated in parallel
- Mutable store only at sites

## Concurrency vs. Backtracking

Given: integer `n`, list of integers `xs`

Return all subsequences of `xs` that sum to `n`.

```
sums(5, [1, -2, 1, 2, 3]) =  
  {[2, 3], [1, 1, 3], [1, -2, 1, 2, 3]}
```

`sums(5, [1, 2, 1])` is silent

```
def sums(0, []) = []
```

```
def sums(_, []) = stop
```

```
def sums(n, x : xs) = sums(n - x, xs) >ys> (x : ys) | sums(n, xs)
```

# Concurrency with Maximal Parallelism

- An **experiment** tosses two dice.  
Experiment is a success iff sum of the two dice thrown is 7.
- $exp(n)$  runs  $n$  experiments and reports the number of successes.

```
def exp(0) = 0
def exp(n) = exp(n - 1)
           + (if toss() + toss() = 7 then 1 else 0)
```

- Arguments of  $+$  evaluated in parallel.

# Simple Parallel Auction

- A list of bidders in a sealed-bid, single-round auction.
- *b.ask()* requests a bid from bidder *b*.
- Ask for bids from all bidders, then publish the highest bid.

```
def auction([]) = 0
```

```
def auction(b : bs) = max(b.ask(), auction(bs))
```

## Notes:

- Arguments of `max` evaluated in parallel.  
All bidders are called simultaneously.
- If some bidder fails, then the auction will never complete.

## Parallel Auction with Timeout

- Take a bid to be 0 if no response is received from the bidder within 8 seconds.

```
def auction([]) = 0
```

```
def auction(b : bs) =  
    max(  
        b.ask() | (Rwait(8000) >> 0),  
        auction(bs)  
    )
```

# Orc Goals

- **Initial Goal:** Internet scripting language.
- **Next:** Component integration language.
- **Next:** A general purpose, structured “concurrent programming language”.
- **A very late realization:** A simulation language.



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- Avoid Technological Solutions:  
specifics of communication, topology, timing
- Avoid overspecification of control/data-flow
- Avoid mapping computations to resources until the very end

A solution is the most abstract algorithm.

# Research Paradigms

- Experimentation
- Classification, Taxonomy
- Abstraction

# A Philosophical Message

- Long ago: Recursion is not **natural**. Users will never use it.
- Today: Concurrency is not **natural**. Users will never get it.

Exascale programming may require combining many unnatural concepts.

**And, still we may not succeed.**