

Yesterday: - Clean semantics & parallelism
- Clean cost model

Lambda Calculus

Work & Span

$$T_P \sim \frac{W}{P}$$

We want

$$T_P = \frac{W}{P} + S \leq 2 \cdot \text{OPT}$$

$$\frac{W}{P} + S \approx \frac{W}{P}$$

$$\alpha\left(\frac{n}{P}\right) + \alpha(\lg^3 n)$$

$n \rightarrow \infty$

So S must be small, so we start with the following question:

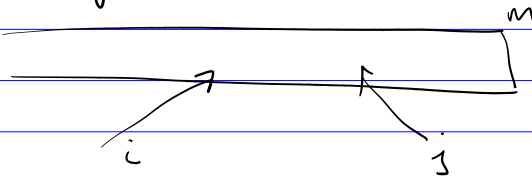
* How to design algorithms with low span?

• Fundamental Data Structures: Sequence

$$\text{Sequence: } a = (a_0, a_1, \dots, a_{n-1}) \quad \left. \begin{array}{l} a[0] = a_0 \\ a[i] = a_i \end{array} \right\} O(1)$$

$$\text{length } a = |a| \quad O(1) \text{ work/span}$$

$$\text{subseq } (a, i, j) = a[i \dots j] = O(1) \text{ work/span}$$



$$\text{split mid } a = \left(\text{subseq}\left(0 \dots \frac{n}{2}-1\right), \text{subseq}\left(\frac{n}{2} \dots n-1\right) \right)$$

Key operation: Tabulate: $(\text{int} \rightarrow \alpha) \rightarrow \text{int} \rightarrow \alpha \text{ seq}$

$$\text{tabulate } (\lambda i \rightarrow i) \ n = (0, 1, \dots, n-1)$$

$$\text{work: } O(n) \quad \text{span: } O(1)$$

$$\sum_i W(f(i))$$

$$\max_i S(f(i))$$

Implementing some std ops on seq w/ tab.

tabulate

- empty seq = tabulate($\lambda i.i$) 0
- singleton e = tabulate($\lambda i.e$) 1
- map f a = tabulate($\lambda i.f a[i]$) |a|
- append a b = tabulate $\{$
 $(\lambda i. \text{if } i < |a| \text{ then } a[i]$
 $\text{else } b[i - |a|]) \mid |a| + |b|\}$
 $O(|a| + |b|) \rightarrow$

iterate $\beta \rightarrow (\lambda \alpha. \alpha \times \beta) \rightarrow \beta \rightarrow \alpha \text{ seq} \rightarrow \beta$

$a = (a_0, a_1, \dots, a_{n-1})$

iterate b ($\lambda(x, y). x + y$) a

iterate 0 ($\lambda(x, a_i). x + a_i$) tabulate($\lambda i.i$) 5
 $= (((0 + 0) + 1) + 2) + 3) + 4$

iterate b ($\lambda(x, y). x + y$) a

EX: (1 0 4 5 2 0 0 3 4) \searrow ?
 (0 1 1 4 5 2 2 2 3 4) \searrow ?

fn: skipZero(x, y) = if $x > 0$ then x
 else y

EX: Insertion Sort

insort a = iterate () insert a

fn insert(x, r) = iterate ... ?
 can you use tabulate?

What's the work
 of iterate?

Work = $\sum_i w(f(x, a[i]))$ Span = $\sum_i S(-)$

Summing up a sequence

iterate $o(\lambda(x,y).x+y) a$

$$= ((0 + a(0)) + a(1)) + \dots + a(n-1)$$

But $+$ is associative, so we could split the sum into multiple parallel threads.

Iterate Prefixes

eg. sum, $(10 \ 2 \ 3 \ 2) \rightarrow (0, 1, 1, 3, 6, 8)$

iterate-prefixes: $\beta \rightarrow (\beta \times \alpha \rightarrow \beta) \rightarrow \alpha \text{ seq} \rightarrow \beta \text{ seq}$

Reduce id f a where id is identity for f .

$$\dots f(f(f(id; a(0)); a(1)), a(2)) \dots$$

reduce $o(\lambda(x,y).x+y) a$

$$id + a(0) + a(1) + \dots + a(n-1)$$

fn reduce id f a = if $|a|=0$ then id
else if $a=1$ then $a(0)$

else let $(b, c) = \{a(0, \dots, \frac{|a|-1}{2}), a(\frac{|a|}{2}, \dots, |a|-1)\}$
 $(rb, rc) = \text{reduce id } b \parallel \text{reduce id } c \}$

in $f(rb, rc)$ end

$$W(n) = 2W(\frac{n}{2}) + O(1) = O(n)$$

$$S(n) = \max(S(\frac{n}{2}), 1) = \lg n$$

Mergesort = reduce $\underbrace{<}_{O(\lg n)}$ merge $\underbrace{\text{map singleton } a}_{O(n) O(1)}$
span

$O(n \lg n)$ work

$O(\lg^2 n)$ span

Contraction

fn reduce id f a =

if $|a| = 0$ then id

else if $|a| = 1$ then $f(id, a(0))$

else $\{ b = \text{tabulate } (\lambda i. f(a(i), a(i+1))) \frac{|a|}{2}$
 reduce id f b $\}$

- iterate \rightarrow sequential
- reduce \rightarrow parallel

Scan id f a

gives for each prefix of a

(reduce id f $\langle \rangle$,
 reduce id f $(a(0))$
 " " $(a(0), a(1))$
 :
 reduce id f $(a(0) \dots a(n-1))$)

(1, 0, 2, 7, 0, 5)

reduce 0 skipzer $\langle \rangle$

" " (1)

" (1 0)

" (1 0 2) = ((0 1 1 2 7 7), 15)

" (1 0 2 7)

(1 0 2 7 0)

red 0 skipzer (1 0 2 7 0 5)

Nature of this computation suggests we need iteration but in fact we can do it in parallel if we're clever



$(1 \ 0 \ 2 \ 7 \ 0 \ 5)$
 \downarrow
 $((0 \ 1 \ 3 \ 10 \ 10), 15)$

want: $O(n)$ work
 $\lg(n)$ span

$(1 \ 0 \ 2 \ 7 \ 0 \ 5)$
 $\backslash / \quad \backslash / \quad \backslash /$
 $(1 \quad 9 \quad 5)$
 \downarrow
 $((\underline{0}, \underline{1}, \underline{10}), 15)$

\hookrightarrow appear in original comp result.

Reference notes for (MU 15210

Lect. notes for sequences, contraction.