



Parallelism & Sequences

15-150 M21

Lecture 0719
19 July 2021

- ✓ Basics of Functional Computation
- ✓ Induction and Recursion
- ✓ Polymorphism & Higher-Order Functions
- ✓ Functional Control Flow
- ✓ The SML Modules System
 - Applications & Connections

0 n-ary Parallelism

The *work* of this is always going to be at least $O(n)$. But how good can we do on the *span*?

What if we could do them *all* at
the same time?

We've defined a signature SEQUENCE, containing an abstract type 'a seq and a variety of operations on seqs.

0719.0 (SEQUENCE.sig)

```
2 signature SEQUENCE =  
3 sig  
4  
5     type 'a t  
6     type 'a seq = 'a t
```

- We've implemented `Seq :> SEQUENCE` such that the functions meets the bounds specified in the documentation

0719.1 (Seq.sml)

```
12 structure Seq :> SEQUENCE =  
13 struct
```

- How's it implemented? Who cares?!
- By analogy to lists, we'll write sequences as

$\langle 1, 3, \sim 7, 2, 6, 4 \rangle : \text{int Seq.seq}$

This is a mathematical notation, *not* SML syntax.

Key Point:

Sequences are *parallel data structures*

In the sequence library, we have:

$$\text{map} : ('a \rightarrow 'b) \rightarrow 'a \text{ seq} \rightarrow 'b \text{ seq}$$

which takes a function f and applies it to every element in a sequence S .

But it performs all these applications **in parallel**: if f has $O(1)$ span, then so too does $\text{map } f$, i.e. the parallel runtime (assuming arbitrarily-many processors) of $\text{map } f \ S$ *does not grow as the length of S grows*.

Documentation:

The Sequence Reference

Live Coding:

Basic Sequence Functions

0719.2 (sandbox.sml)

```
10 fun rev S =  
11   let  
12     val n = Seq.length S    (* O(1) *)  
13   in  
14     (* O(n) work, O(1) span *)  
15     Seq.tabulate (fn i => Seq.nth S (n-i-1)) n  
16   end
```

0719.3 (sandbox.sml)

```
26 fun append(S1, S2) =
27   let
28     (* O(1) *)
29     val (m, n) = (Seq.length S1, Seq.length S2)
30
31     (* O(1) *)
32     fun f i = case i < m of
33                 true => Seq.nth S1 i
34                 | false => Seq.nth S2 (i - m)
35   in
36     (* O(n+m) work, O(1) span *)
37     Seq.tabulate f (m + n)
38   end
```

0719.4 (sandbox.sml)

```
47 val sum = Seq.reduce op+ 0
```

0719.5 (sandbox.sml)

```
57 infix |>  
58 fun x |> f = f x  
59  
60 fun mappartial f S =  
61     S |> (Seq.map f)  
62     |> (Seq.filter Option.isSome)  
63     |> (Seq.map Option.valueOf)
```

0719.6 (sandbox.sml)

```
74 fun double S =  
75   let  
76     fun twoseq x = Seq.append(  
77       Seq.singleton x,  
78       Seq.singleton x)  
79   in  
80     Seq.mapreduce  
81       twoseq  
82       (Seq.empty()) Seq.append  
83       S  
84   end
```

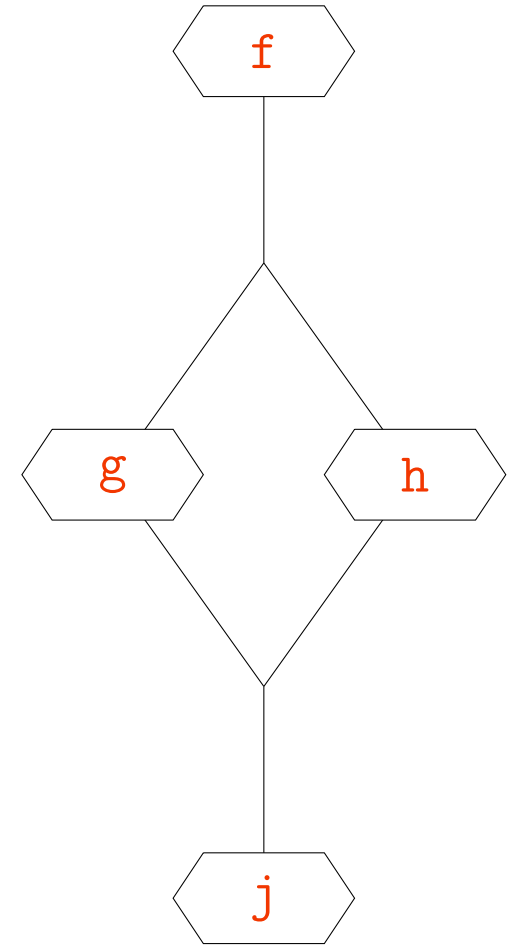

0719.7 (sandbox.sml)

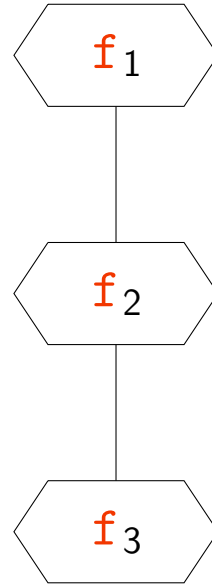
```
88 fun double ' S =  
89   Seq.tabulate  
90     (fn i => Seq.nth S (i div 2))  
91     (2 * Seq.length(S))
```

5-minute break

1 Cost Graphs

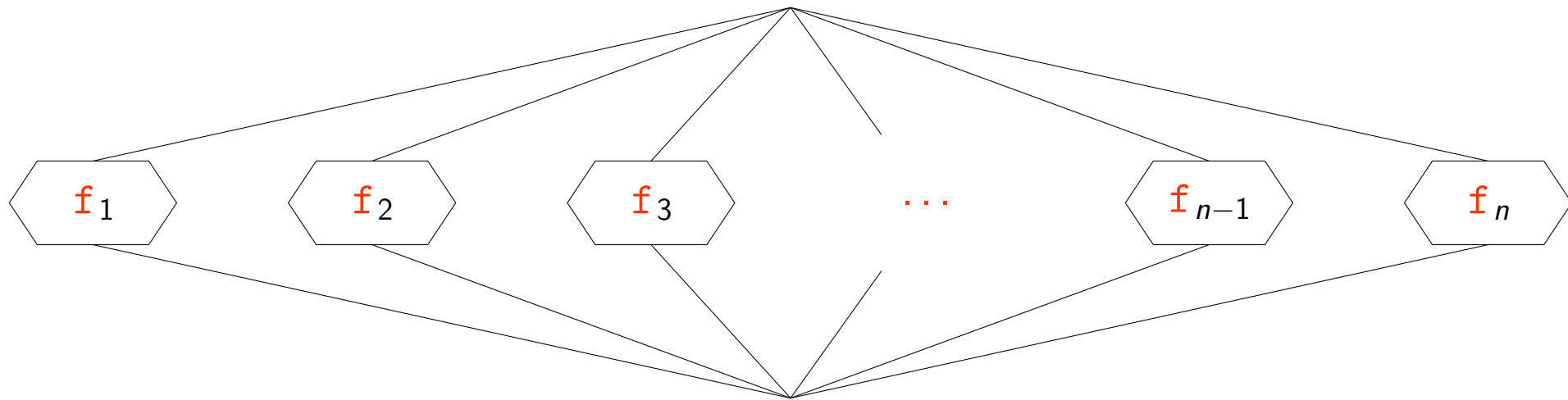
- Goal: establish a way to reason visually about the asymptotic runtime of algorithms
- Will represent algorithms as *directed acyclic graphs*
- Will reason about the runtime properties of the algorithm as properties of the graph.





$f_1; f_2; f_3$

Depicting Parallel Evaluation



$$f_1 \parallel f_2 \parallel f_3 \parallel \cdots \parallel f_{n-1} \parallel f_n$$

Key Idea: Can use cost graphs
to determine the work & span of
a function

Work: Sum of total cost in graph

Span: Height of longest path through graph

Demonstration:

**Work & Span Analysis using
cost graphs**

- Prove equivalence of two structures ascribing to the same signature by relating values representing the same structure
- Carefully invariants and dutifully maintain them, using the opacity of the modules system to prevent the user from breaking them

- Start *Applications* portion of course
- Parallel data structures and algorithms

Thank you!