

Parallelism is "hard" ... or is it?

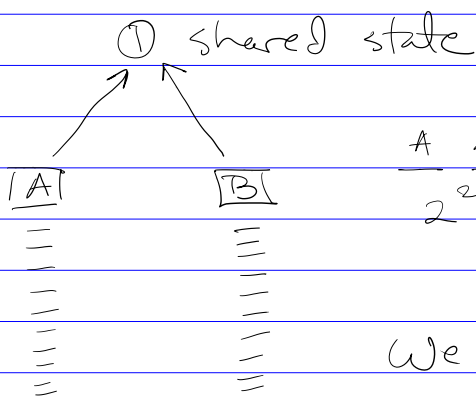
Language-based cost models!

- abstract
- truthful

"cs should be as advanced
as restaurant business"

Assume: Pure Functional Programs

no shared (mutable) state



A A B A B B ...
 2^{20} possible interleaving
of instructions

We can't reason about
correctness of such programs.

λ -calc is a good model for writing and
reasoning about programs.

Cost semantics

simple, w/ a little twist: we care not only
about work, but
also "span".

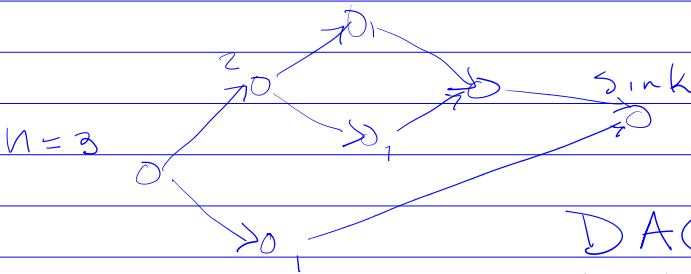
Cost = Work \leftarrow sequential runtime (additive)
+ Span \leftarrow parallel (Max)

Example

fun $f \cdot x =$ if $x \leq 1$ then x
else let $(a, b) = (f(x-1) \parallel f(x-2))$
in $a + b$ end

$$W(n) = \begin{cases} 1 & \text{if } n \leq 1 \\ W(n-1) + W(n-2) + 1 & \text{o/w} \end{cases}$$

$$S(n) = \begin{cases} 1 & \text{if } n \leq 1 \\ \max(S(n-1), S(n-2)) & \text{o/w} \end{cases}$$



DAG (dir. acyclic graph)

But only a subset of

DAGs are relevant

(series-parallel DAGs)

Want

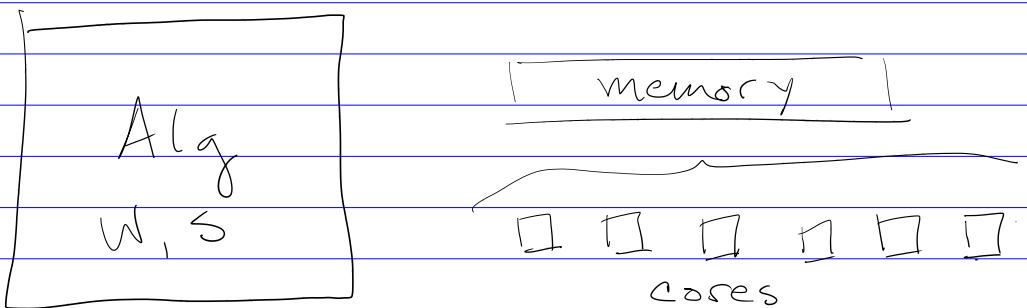
• Work Efficient

• Low Span

How do we make our abstract cost model
TRUTHFUL?

Provably Efficient Implementations

Bounded Implementation



Parallel algorithm should agree with sequential semantics. (The^{ie} result should be the same as when doing it sequentially)

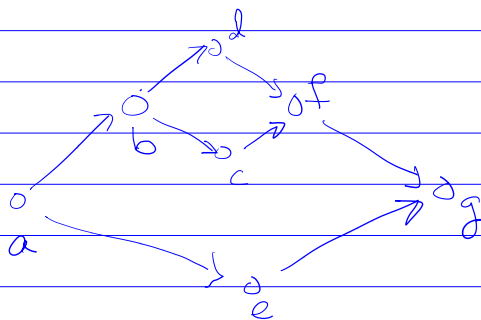
Lower Bounds : $T_p \geq W/p$ $T_p \geq S$

Determining T_p^{OPTIMAL} is NP-complete.

However, approximating the optimal is easy.

Schedule (for example above)

1	a	
2	b	c
3	d	e
4	f	
5	g	



(NB. This is not breadth-first.)

Let $w_i = \#$ vertices at level i

$$W = \sum_{i=1}^s w_i$$

$$T_P = \sum_{i=1}^s \left\lceil \frac{w_i}{P} \right\rceil = \sum_{i=1}^s \left\lfloor \frac{w_i}{P} \right\rfloor + 1 = \left(\sum_{i=1}^s \left\lfloor \frac{w_i}{P} \right\rfloor \right) + S$$

$$\leq \sum_{i=1}^s \frac{w_i}{P} + S = \frac{W}{P} + S$$

(This is Brent's Theorem (1974))

$$\underline{\text{Claim:}} \quad T_P \leq \frac{W}{P} + S \leq 2 * T^{\text{OPT}}$$

$$T_P \geq \frac{W}{P} \quad \left\{ \begin{array}{l} T_P \geq \max\left(\frac{W}{P}, S\right) \end{array} \right.$$

$$T_P \geq S$$

$$\text{so } T_P^{\text{OPT}} \geq \max\left(\frac{W}{P}, S\right)$$

(The cost of the scheduler
vs
length of the schedule (T_P)) will come back to this.

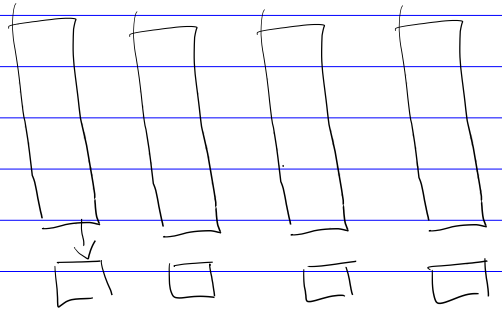
Greedy scheduling

If \exists idle processors $\wedge \exists$ ready vertices then assign.

$$\underline{\text{Theorem:}} \quad T_P \leq \frac{W}{P} + S \cdot \frac{(P-1)}{P}$$

$$T_P = \frac{\text{total tasks left}}{P} \leq \frac{W + (P-1) \cdot S}{P}$$

Distributed Queues



Work stealing
for Load Balancing

If proc. is idle,
Try to steal work from
other proc. queues.

Now our algorithm is concurrent instead
of parallel. Very hard to implement
correctly and efficiently.

Probabilistic Algorithm with expected cost

$$E[T_P] \leq \frac{W}{P} + S \quad (\text{includes cost of scheduler})$$