ESE535:
Electronic Design Automation
Day 8: February 11, 2015
Scheduling Introduction
Penn

## General Problem

- Resources are not free
- Wires, io ports
- Functional units
- LUTs, ALUs, Multipliers, ....
- Memory access ports
- State elements
- memory locations
- Registers
- Flip-flop
- loadable master-slave latch
- Multiplexers (mux)

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| Today <br> - Scheduling <br> - Basic problem <br> - Variants <br> - List scheduling approximation |  |
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## Trick/Technique

- Resources can be shared (reused) in time
- Sharing resources can reduce
- instantaneous resource requirements
- total costs (area)
- Pattern: scheduled operator sharing

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## Sharing

- Does not have to increase delay
- w/ careful time assignment
- can often reduce peak resource requirements
- while obtaining original (unshared) delay
- Alternately: Minimize delay given fixed resources

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## Scheduling

- Task: assign time slots (and resources) to operations
- time-constrained: minimizing peak resource requirements
- n.b. time-constrained, not always constrained to minimum execution time
- resource-constrained: minimizing execution time



## Preclass 2

- Schedule onto two adders
- Does the number of cycles depend on i[7], i[6], ... i[0] ?
- How many cycles?



## Preclass 3

- Schedule onto:
- 2 adders (+)
- 2 incrementer (++)
- 2 comparator (>)
- Does the number of cycles depend on
i[7], i[6], ... i[0] ?
- How many cycles?
- sum=0; for $(\mathrm{j}=0 ;[\mathrm{ij}]>0 ; \mathrm{j}++$ ) sum+=ijj];
- Data independent
- graph static
- resource requirements and execution time
- independent of data
- schedule staticly
- maybe bounded-time guarantees
- typical ECAD problem

Two Types (2)

## - Data Dependent

- execution time of operators variable
- depend on data
- flow/requirement of operators data dependent
- if cannot bound range of variation
- must schedule online/dynamically
- cannot guarantee bounded-time
- general case (I.e. halting problem)
- typical "General-Purpose" (non-real-time) OS problem

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## ASAP Schedule As Soon As Possible (ASAP)

- For each input
- mark input on successor
- if successor has all inputs marked, put in visit queue
- While visit queue not empty
- pick node
- update time-slot based on latest input - Time-slot = max(time-slot-of-inputs)+1
- mark inputs of all successors, adding to visit queue when all inputs marked
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Unbounded Resource Problem

- Easy:
- compute ASAP schedule
- I.e. schedule everything as soon as predecessors allow
- will achieve minimum time
- won't achieve minimum area
- (meet resource bounds)

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## Also Useful to Define ALAP

- As Late As Possible
- Work backward from outputs of DAG
- Also achieve minimum time w/ unbounded resources

Rework
Example


Two Bounds

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## Bounds

- Useful to have bounds on solution
- Two:
- CP: Critical Path
- Sometimes call it "Latency Bound"
- RB: Resource Bound
- Sometimes call it "Throughput Bound" or "Compute Bound"


## Resource Capacity Lower Bound

- Sum up all capacity required per resource
- Divide by total resource (for type)
- Lower bound on remaining schedule time
- (best can do is pack all use densely)
- Ignores schedule constraints

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## Critical Path Lower Bound

- ASAP schedule ignoring resource constraints
- (look at length of remaining critical path)
- Certainly cannot finish any faster than that



Single Resource Hard (4)


List Scheduling


## List Scheduling

 (basic algorithm flow)- Keep a ready list of "available" nodes
- (one whose predecessors have already been scheduled)
- Like ASAP queue
- But won't necessary process in FIFO order
- While there are unscheduled tasks
- Pick an unscheduled task and schedule on first available resource after its predecessors
- Put any tasks enabled by this one on ready list


## List Scheduling

- Greedy heuristic
- Key Question: How prioritize ready list?
- What is dominant constraint?
- least slack (worst critical path) $\rightarrow$ LPT
- LPT = Longest Processing Time first
- enables work
- utilize most precious (limited) resource
- So far:
- seen that no single priority scheme would be optimal



## Approximation

- Can we say how close an algorithm comes to achieving the optimal result?
- Technically:
- If can show
- Heuristic(Prob)/Optimal(Prob) $\leq \alpha \quad \forall$ Prob
- Then the Heuristic is an $\alpha$-approximation



## List Scheduling

- Use for
- resource constrained
- time-constrained
- give resource target and search for minimum resource set
- Fast: $\mathrm{O}(\mathrm{N}) \rightarrow \mathrm{O}(\mathrm{Nlog}(\mathrm{N}))$ depending on prioritization
- Simple, general
- Good for upper bound - results is achievable
- Not always optimal
- How good?

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- No idle time up to start of last job to finish
- start time of last job $\leq \mathrm{L}$
- last job length $\leq$ L
- Total LS length $\leq 2 \mathrm{~L}$
-What can say about optimality?
$>$ Algorithm is within factor of 2 of optimum


## Recover Precedence

- With precedence we may have idle times, so need to generalize
- Work back from last completed job
- two cases:
- entire machine busy
- some predecessor in critical path is running
- Divide into two sets
- whole machine busy times
- critical path chain for this operator

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## Precedence Constrained

- Optimal Length > All busy times
- Optimal Length $\geq$ Resource Bound
- Resource Bound $\geq$ All busy
- Optimal Length>This Path
- Optimal Length $\geq$ Critical Path
- Critical Path $\geq$ This Path
- List Schedule $=$ This path + All busy times
- List Schedule $\leq 2$ *(Optimal Length)


## Results

- Scheduling of identical parallel machines has a 2-approximation
- i.e. we have a polynomial time algorithm which is guaranteed to achieve a result within a factor of two of the optimal solution.
- In fact, for precedence unconstrained there is a 4/3-approximation
- i.e. schedule Longest Processing Time first Penn ESE535 Spring 2015 -- DeHon

Precedence


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## Conclude

- Scheduling of identical parallel machines with precedence constraints has a 2-approximation.


## Tightening

- How could we do better?
- What is particularly pessimistic about the previous cases?
- List Schedule $=$ This path + All busy times
- List Schedule $\leq 2$ *(Optimal Length)


## Tightening

- Example of
- More information about problem
- More internal variables
- ...allow us to state a tighter result
- 2-approx for any graph
- Since CP may = RB
- Tighter approx as CP and RB diverge


## Bounds

- Precedence case, Identical machines
- no polynomial approximation algorithm can achieve better than 4/3 bound - (unless P=NP)
- Heterogeneous machines (no precedence)
- no polynomial approximation algorithm can achieve better than $3 / 2$ bound

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## Tighten

- LS schedule $\leq$ Critical Path+Resource Bound
- LS schedule $\leq \operatorname{Min}(C P, R B)+M a x(C P, R B)$
- Optimal schedule $\geq \operatorname{Max}(\mathrm{CP}, \mathrm{RB})$
- LS/Opt $\leq 1+\operatorname{Min}(C P, R B) / M a x(C P, R B)$
- The more one constraint dominates $\rightarrow$ the closer the approximate solution to optimal (EEs think about 3dB point in frequency response)

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## Multiple Resource

- Previous result for homogeneous functional units
- For heterogeneous resources:
- also a 2-approximation
- Lenstra+Shmoys+Tardos, Math. Programming v46p259
- (not online, no precedence constraints)

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## Summary

- Resource sharing saves area
- allows us to fit in fixed area
- Requires that we schedule tasks onto resources
- General kind of problem arises
- We can, sometimes, bound the "badness" of a heuristic
- get a tighter result based on gross properties of the problem
- approximation algorithms often a viable alternative to finding optimum
- play role in knowing "goodness" of solution

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## Big Ideas:

- Exploit freedom in problem to reduce costs
- (slack in schedules)
- Use dominating effects
- (constrained resources)
- the more an effect dominates, the "easier" the problem
- Technique: Approximation

| Admin |
| :---: |
| - Reading on web for Monday |
| - Same reading for today and Monday |
| - Assignment 4 Due Thursday |
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