

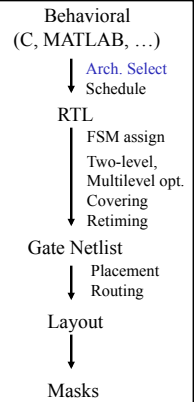
ESE535: Electronic Design Automation

Day 15: March 16, 2011
Architecture Synthesis
(Provisioning, Allocation)



Today

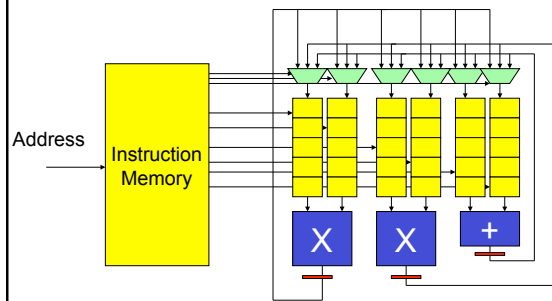
- Problem
- Brute-Force/Exhaustive
- Greedy
- Estimators
- Analytical Provisioning
- ILP Schedule and Provision



Previously

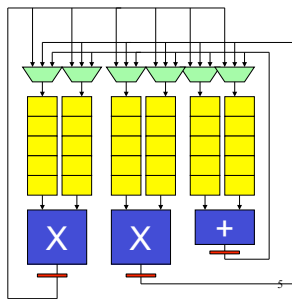
- General formulation for scheduled operator sharing
 - VLIW
- Fast algorithms for scheduling onto fixed resource set
 - List Scheduling

VLIW



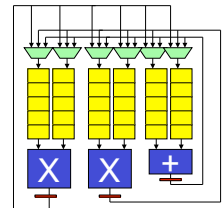
Today

- How do we determine the set of resources?



Today: Provisioning

- Given
 - An area budget
 - A graph to schedule
 - A library of operators
- Determine:
 - Delay minimizing set of operators
 - Or delay-achieving set of operators
 - i.e. select the operator set



Exhaustive

1. Identify all area-feasible operator sets
 - E.g. preclass exercise
2. Schedule for each
3. Select best

- → optimal
- Drawbacks?

Exhaustive

- How large is space of feasible operator sets?
 - As function of
 - operator types – N
 - Types: add, multiply, divide,
 - Maximum number of operators of type M

$$M^N$$

Size of Feasible Space

- Consider 10 operators
 - For simplicity all of unit area
- Total area of 100

- How many cases?

$$\binom{100}{9} \approx 2 \times 10^{12}$$

Implication

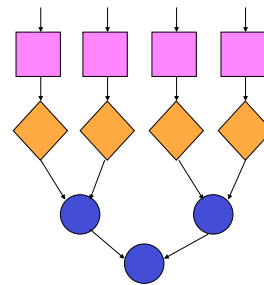
- Feasible operator space can be too large to explore exhaustively

Greedy Incremental

- Start with one of each operator
- While (there is area to hold an operator)
 - Which single operator
 - Can be added without exceeding area limit?
 - And provides largest benefit?
 - Add one operator of that type
- How long does this run?
 - $T_{\text{schedule}}(E) \cdot O(N \cdot M)$
 - [M = # types, N=final # operators]

- Weakness?

Example



Find best 5 operator solution.

Example

Find best 5 operator solution.

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Example

One of each.

| Sq | Dia | Circ |
|----|-----|------|
| A | | |
| B | E | |
| C | F | |
| D | G | I |
| | H | |
| | | J |
| | | K |

Find best 5 operator solution.

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Example

Two Squares

| Sq | Dia | Circ |
|-----|-----|------|
| A,B | | |
| C,D | E | |
| | F | |
| | G | I |
| | H | |
| | | J |
| | | K |

Find best 5 operator solution.

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Example

Two Diamonds

| Sq | Dia | Circ |
|----|-----|------|
| A | | |
| B | E | |
| C | F | |
| D | G | I |
| | H | |
| | | J |
| | | K |

Find best 5 operator solution.

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Example

Two Circles

| Sq | Dia | Circ |
|----|-----|------|
| A | | |
| B | E | |
| C | F | |
| D | G | I |
| | H | |
| | | J |
| | | K |

Find best 5 operator solution.

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Example

Which should greedy add?

Find best 5 operator solution.

Incremental addition does not accelerate.

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Example

Two sqs
+ Two diamonds

| Sq | Dia | Circ |
|-----|-----|------|
| A,B | | |
| C,D | E,F | |
| | G,H | I |
| | | J |
| | | K |

Find best 5 operator solution.

Max effect:
Incremental
may not suggest
next single addition.

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Analytic Formulation

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Challenge

- Scheduling expensive
 - $O(|E|)$ or $O(|E| \log(|V|))$ using list-schedule
- Results not analytic
 - Cannot write an equation around them
- Bounds are sometimes useful
 - No precedence \rightarrow is resource bound
 - Often one bound dominates
 - Latency bound unaffected by operator count

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Estimations

- Step 1: estimate with resource bound
 - $O(|E|)$ vs. $O(N)$ evaluation
- Step 2: use estimate in equations
 - $T = \max(N_1/R_1, N_2/R_2, \dots)$
- Most useful when $RB \gg CP$

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Constraints

- Let A_i be area of operator type i
- Let x_i by number of operators of type i

$$\sum A_i \times x_i \leq Area$$

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Achieve Time Target

- Want to achieve a schedule in T cycles
- Each resource bound must be less than T cycles:
 - $N_i/x_i \leq T$

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Algebraic Solve

- Set of equations
 - $N_i/x_i \leq T$
 - $\sum A_i x_i \leq Area$
- Assume equality for time bound
- $N_i/x_i=T \rightarrow x_i=N_i/T$

$$\frac{\sum A_i \times N_i}{T} \leq Area$$

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Rearranging

$$\frac{\sum A_i \times N_i}{T} \leq Area$$

$$\frac{\sum A_i \times N_i}{Area} \leq T$$

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Bounding T

- Gives Lower Bound on T

$$\frac{\sum A_i \times N_i}{Area} \leq T$$

Intuition: N of each is right balance given unbounded area;
Scale to area available.

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Preclass

- What is T_{lower} for preclass?

$$\frac{\sum A_i \times N_i}{Area} \leq T$$

$$T \geq \frac{1 \times 8 + 2 \times 4}{7} = \frac{16}{7} \approx 2.3 \quad T \geq 3$$

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Back Substitute from T to x

- $x_i=N_i/T$

$$\frac{\sum A_i \times N_i}{Area} \leq T$$
- x_i won't necessarily be integer
 - Round down definitely feasible solution
 - May have room to move a few up by 1

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Preclass

- $x_i=N_i/T$
- $T \geq 3$
- X_{add}, X_{mpy} ?
- $X_{add} = 8/3 \rightarrow 2$ or 3
- $X_{mpy} = 4/3 \rightarrow 1$ or 2

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Counter Example

- 1 Unit each
- Area = 4 Units
- What would analytic predict?
- What is best?
- How does CP compare to RB?

- Analytic Resource Estimate
- Most useful when $RB \gg CP$

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Analytic Counter Example

- How would greedy incremental work on this one?

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ILP

Maybe we can do exhaustive,
if we formulate properly.

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ILP

- Integer Linear Programming
- Formulate set of linear equation constraints (inequalities)
 - $Ax_0 + Bx_1 + Cx_2 \leq D$
 - $x_0 + x_1 = 1$
 - A, B, C, D – constants
 - x_i – variables to satisfy
 - No products on variables, just linear weighted sums
- Can constrain variables to integers
- No polynomial time guarantee
 - But often practical
 - Solvers exist (significant piece next lecture)

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ILP Provision and Schedule

Now to make it look like an ILP nail...

- Formulate operator selection and scheduling as ILP problem

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Formulation

- Integer variables M_i
 - number of operators of type i
- 0-1 (binary) variables $x_{i,j}$
 - 1 if node i is scheduled into timestep j
 - 0 otherwise
- Variable assignment completely specifies operator selection and schedule
- This formulation for achieving a target time T
 - j ranges 0 to $T-1$

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Target T → Min T

- Formulation targets T
- What if we don't know T?
 - Want to minimize T?
- Do binary search for minimum T
 - How does that impact solution time?

Constraints

What properties must hold true for a solution to be valid?

1. Total area constraints
2. Not assign too many things to a timestep
3. Assign every node to some timestep
4. Maintain precedence

(1) Total Area

- Same as before

$$\sum A_i \times M_i \leq Area$$

(2) Not overload timestep

- For each timestep j
 - For each operator type k

$$\sum_{o_i \in FU_k} x_{i,j} \leq M_k$$

(3) Node is scheduled

- For each node in graph

$$\sum_j x_{i,j} = 1$$

Can narrow to sum over slack window.

(4) Precedence Holds

- For each edge from node *src* to node *snk*

$$\sum_j j \times x_{src,j} - \sum_j j \times x_{snk,j} \leq -1$$

Can narrow to sum over slack windows.

Constraints

Roughly what provided code is checking in sched_main

1. Total area constraints
2. Not assign too many things to a timestep
3. Assign every node to some timestep
4. Maintain precedence

ILP Solver

- ILP Solver can take these constraints and find a solution (satisfying assignment)
- On Monday, will see how to start to make this practical

SAT/ILP Scheduling Variant

(Demonstration)

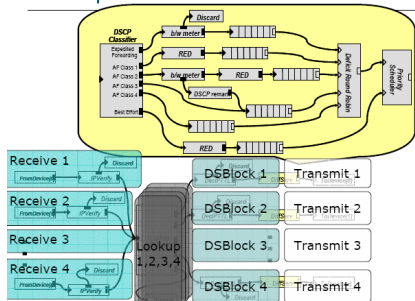
<if time permits>

Two Constraint Challenge

- Processing elements have limited memory
 - Instruction memory (data memory)
- Tasks have different requirements for compute and instruction memory
 - *i.e.* Run length not correlated to code length
- No provisioning, scheduling

Plishker Task Example

Example: 4 Port DiffServ



Task

- **Task:** schedule tasks onto PEs obeying **both** memory and compute capacity limits

Example from DiffServ

| Resource | Receive | Look-up | DSBlock | Transmit |
|------------------|---------|---------|---------|----------|
| Execution Cycles | 98 | 134 | 320 | 296 |
| Instructions | 462 | 218 | 1800 | 985 |

Example and ILP solution From Plishker et al. NSCD2004

Task

- **Task:** schedule tasks onto PEs obeying both memory and compute capacities
- → two capacity assignment problem
- → two capacity bin packing problem
- Task: $i \langle C_i, I_i \rangle$

SAT Packing

Variables:

- $A_{i,j}$ – task i assigned to resource j

Constraints

- Coverage constraints
- Uniqueness constraints
- Cardinality constraints

- PE compute
- PE memory

$$U_i = \sum_j A_{i,j} = 1$$

$$\sum_i (A_{i,j} \times C_i) \leq PE.cap(j)$$

Allow Code Sharing

- Two tasks of same type can share code
- Instead of memory capacity
 - Vector of memory usage
- Compute PE lmem vector
 - As OR of task vectors assigned to it
- Compute mem space as sum of non-zero vector entry weights (dot product)

Allow Code Sharing

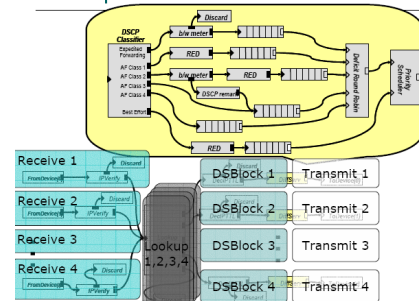
- Two tasks of same type can share code
- Task has vector of memory usage
 - Task i needs set of instructions $k: T_{i,k}$
- Compute PE lmem vector
 - OR (all i): $PE.lmem_{j,k} += A_{i,j} * T_{i,k}$
- PE Mem space
 - $PE.Total_lmem_j = \sum (PE.lmem_{j,k} * Instrs(k))$

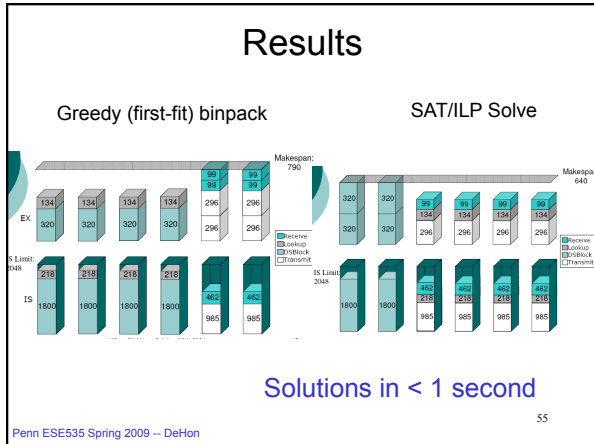
Symmetries

- Many symmetries
- Speedup with symmetry breaking
 - Tasks in same class are equivalent
 - PEs indistinguishable
 - Total ordering on tasks and PEs
 - Add constraints to force tasks to be assigned to PEs by ordering
 - Plishker claims “significant runtime speedup”
 - Using GALENA [DAC 2003] pseudo-Boolean SAT solver

Plishker Task Example

Example: 4 Port DiffServ





[skipped over this]

Why can they do this?

- Ignore precedence?
- Ignore Interconnect?

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[skipped over this]

Why can they do this?

- Ignore precedence?
 - feed forward, buffered
- Ignore Interconnect?
 - Through shared memory, not dominant?

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[skipped over this]

Interconnect Buffers

- Allow “Software Pipelining”

Each data item

Spatial we would pipeline, running all three at once

Think of each schedule instance as one timestep in spatial pipeline.

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[skipped over this]

Interconnect Buffer

A → B → C

50 100 50

PE0: [C | A]

PE1: [B]

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Round up Algorithms and Runtimes

- Exhaustive Schedule
- Greedy Schedule
- Analytic Estimates
- ILP formulation

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Admin

- Assign 5a Monday
- Reading for Monday on web

Big Ideas:

- Estimators
- Dominating Effects
- Reformulate as a problem we already have a solution for
 - ILP
- Technique: Greedy
- Technique: ILP