ESE535:
Electronic Design Automation
Day 6: February 4, 2014
Partitioning 2
(spectral, network flow)
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## Why this Target?

- Minimize sum of squared wire distances
- Prefer:
- Area: minimize channel width
- Delay: minimize critical path length


## Preclass: Initial Placement

- Metrics:
- Wirelength
- Squared wirelength
- Channel width
- Critical path length


## Spectral Ordering

Minimize Squared Wire length -- 1D layout

- Start with connection array $C\left(c_{i, j}\right)$
- "Placement" Vector X for $x_{i}$ placement
- Problem:
- Minimize cost $=\quad 0.5 \times \sum \sum c_{i, j}\left(x_{i}-x_{j}\right)^{2}$
- cost sum is $X^{\top} B X$
- $\mathrm{B}=\mathrm{D}-\mathrm{C}$
- $\mathrm{D}=$ diagonal matrix, $\mathrm{d}_{\mathrm{i}, \mathrm{i}}=\Sigma($ over j$) \mathrm{c}_{\mathrm{i}, \mathrm{j}}$

| C Matrix |  |  |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
|  A B C G H O <br> A    1   <br> B    1 1  <br> C     1  <br> G 1 1    1 <br> H  1 1   1 <br> O    1 1  |  |  |  |  |  |  |
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## Preclass Netlist

- Squared wire lengths:

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|  |  |  |  |  |  |  | X |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | A | B | C | G | H | 0 |  |  |  |
| A | 1 |  |  | -1 |  |  | $\mathrm{X}_{\text {A }}$ |  | $\mathrm{X}^{-}{ }^{-} \mathrm{X}_{6}$ |
| B |  | 2 |  | -1 | -1 |  | $\mathrm{X}_{\mathrm{B}}$ |  | $2 X_{B}{ }^{-} \mathrm{X}_{G}-\mathrm{X}_{\mathrm{H}}$ |
| C |  |  | 1 |  | -1 |  | $\mathrm{X}_{\mathrm{C}}$ | $=$ | $\mathrm{X}_{\mathrm{C}}{ }^{-} \mathrm{X}_{\mathrm{H}}$ |
| G | -1 | -1 |  | 3 |  | -1 | $\mathrm{X}_{\mathrm{G}}$ |  | $3 X_{G}-X_{A}-X_{B}-X_{0}$ |
| H |  | -1 | -1 |  | 3 | -1 | $\mathrm{X}_{\mathrm{H}}$ |  | $3 X_{H}{ }^{-} \mathrm{X}_{B}-\mathrm{X}_{\mathrm{C}}-\mathrm{X}_{0}$ |
| O |  |  |  | -1 | -1 | 2 | $\mathrm{X}_{\mathrm{O}}$ |  | $2 X_{0}-X_{G}{ }^{-} \mathrm{X}_{\mathrm{H}}$ |
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| $X^{\top}(B X)$ |  |
| :---: | :---: |
| $\begin{gathered} x_{A}{ }^{2}-x_{A} x_{G} \\ +2 x_{B}{ }^{2}-x_{B} x_{G}-x_{B} x_{H} \\ +X_{C}{ }^{2}-x_{C} x_{H} \\ +3 x_{G}{ }^{2}-x_{A} x_{G}-x_{B} x_{G}-x_{G} x_{0} \\ +3 x_{H}{ }^{2}-x_{B} x_{H}-x_{C} x_{H}-x_{H} x_{O} \\ +2 x_{0}{ }^{2}-x_{G} x_{0}-x_{H} x_{O} \end{gathered}$ | $\begin{gathered} \left(X_{A}-x_{G}\right)^{2} \\ +2 x_{B}{ }^{2}-x_{B} x_{G}-x_{B} x_{H} \\ +X_{C}{ }^{2}-x_{C} x_{H} \\ +2 x_{G}{ }^{2-} x_{B} x_{G}-x_{G} x_{0} \\ +3 x_{H}{ }^{2}-x_{B} x_{H}-x_{C} x_{H}-x_{H} x_{O} \\ +2 x_{0}{ }^{2}-x_{G} x_{0}-x_{H} x_{0} \end{gathered}$ |
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## Can See Will Converage To..

- Squared wire lengths:
$\left(X_{A}-X_{G}\right)^{2}$
$+\left(X_{B}-X_{G}\right)^{2}$
$+\left(X_{B}-X_{H}\right)^{2}$
$+\left(\mathrm{X}_{\mathrm{C}}-\mathrm{X}_{\mathrm{H}}\right)^{2}$
$+\left(X_{G}-X_{O}\right)^{2}$
$+\left(X_{H}-X_{O}\right)^{2}$

$$
\begin{gathered}
\left(X_{A}^{-}-X_{G}\right)^{2}+\left(X_{B}{ }^{-} X_{G}\right)^{2} \\
+X_{B}{ }^{2-} X_{B} X_{H} \\
+X_{C}{ }^{2-} X_{C} X_{H} \\
+X_{G}{ }^{2-} X_{G} X_{O} \\
+3 X_{H}{ }^{2-} X_{B} X_{H} X_{C} X_{H}- \\
X_{H} X_{\mathrm{O}} \\
+2 X_{O}{ }^{2-} X_{G} X_{O}-X_{H} X_{O} \\
\hline
\end{gathered}
$$

## Trying to Minimize

- Squared wire lengths:
$\left(X_{A}-X_{G}\right)^{2}$
$+\left(X_{B}-X_{G}\right)^{2} \quad$ Make all $X_{i}$ 's same? $+\left(X_{B}-X_{H}\right)^{2}$
$+\left(\mathrm{X}_{\mathrm{C}}-\mathrm{X}_{\mathrm{H}}\right)^{2} \quad$ - ...but, we probably $+\left(X_{G}-X_{O}\right)^{2} \quad$ need to be in unique $+\left(X_{H}-X_{O}\right)^{2}$ positions.

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- Which we know is also $X^{\top} B X$


## Spectral Ordering

- Add constraint: $\mathrm{X}^{\top} \mathrm{X}=1$
- prevent trivial solution all $x_{i}$ 's $=0$
- Minimize cost=$=X^{\top} B X$ w/ constraint
- minimize $\mathrm{L}=\mathrm{X}^{\top} \mathrm{BX}-\lambda\left(\mathrm{X}^{\top} \mathrm{X}-1\right)$
$-\partial L / \partial X=2 B X-2 \lambda X=0$
- (B- $\lambda l$ ) $X=0$
- What does this tell us about $\mathrm{X}, \lambda$ ?
$-X \rightarrow$ Eigenvector of $B$
- cost is Eigenvalue $\lambda$

Eigenvector for B
For this B Matrix

|  | A | B | C | G | H | O |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| A | 1 |  |  | -1 |  |  |
| B |  | 2 |  | -1 | -1 |  |
| C |  |  | 1 |  | -1 |  |
| G | -1 | -1 |  | 3 |  | -1 |
| H |  | -1 | -1 |  | 3 | -1 |
| O |  |  |  | -1 | -1 | 2 |

Eigenvector is:

| $X_{A}$ |
| :--- |
| $X_{B}$ |
| $X_{C}$ |
| $X_{G}$ |
| $X_{H}$ |
| $X_{\mathrm{O}}$ |$=$| 0.6533 |
| :--- |
| $1.116 \mathrm{E}-14$ |
| -0.6533 |
| 0.2706 |
| -0.2706 |
| $1.934 \mathrm{E}-14$ |

## Eigenvector for B

Eigenvector is:
Order?

| $X_{A}$ |
| :--- |
| $X_{B}$ |
| $X_{C}$ |
| $X_{G}$ |
| $X_{H}$ |
| $X_{\mathrm{O}}$ |$=$| 0.6533 |
| :--- |
| $1.116 \mathrm{E}-14$ |
| -0.6533 |
| 0.2706 |
| -0.2706 |
| $1.934 \mathrm{E}-14$ |

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## Spectral Solution

- Smallest eigenvalue is zero
- Corresponds to case where all $x_{i}$ 's are the same $\rightarrow$ uninteresting
- Second smallest eigenvalue (eigenvector) is the solution we want


## Spectral Ordering

- X ( $x_{i}$ 's) continuous
- use to order nodes
- We need at discrete locations
- this is one case where can solve ILP from LP
- Solve LP giving continuous $x_{i}$ 's
- then move back to closest discrete point

Eigenvector is:

| $\mathrm{X}_{\mathrm{A}}$ |
| :--- |
| $\mathrm{X}_{\mathrm{B}}$ |
| $\mathrm{X}_{\mathrm{C}}$ |
| $\mathrm{X}_{\mathrm{G}}$ |
| $\mathrm{X}_{\mathrm{H}}$ |
| $\mathrm{X}_{\mathrm{O}}$ |$=$| 0.6533 |
| :--- |
| $1.116 \mathrm{E}-14$ |
| -0.6533 |
| 0.2706 |
| -0.2706 |
| $1.934 \mathrm{E}-14$ |


| Spectral Ordering Option <br> - Can encourage "closeness" <br> - Making some $\mathrm{c}_{\mathrm{i}, \mathrm{j}}$ larger |  |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| - Must allow |  | A | B | C | G | H | 0 |
| not close | A | 1 |  |  | -1 |  |  |
| - Could use $\mathrm{c}_{\mathrm{i}, \mathrm{j}}$ | B |  | 2 |  | -1 | -1 |  |
| for power opt | C |  |  | 1 |  | -1 |  |
| $-\mathrm{c}_{\mathrm{i}, \mathrm{j}}=\mathrm{P}_{\text {switch }}$ | G | -1 | -1 |  | 3 |  | - |
|  | H |  | -1 | -1 |  | 3 | - |
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## Spectral Partitioning

- Can form a basis for partitioning
- Attempts to cluster together connected components
- Create partition from ordering
- E.g. Left half of ordering is one half, right half is the other


## Spectral Partitioning Options

- Can bisect by choosing midpoint
- (not strictly optimizing for minimum bisect)
- Can relax cut critera
- min cut w/in some $\delta$ of balance
- Ratio Cut
- Minimize (cut/|A||B|)
- idea tradeoff imbalance for smaller cut
- more imbalance $\rightarrow$ smaller $|A||B|$
- so cut must be much smaller to accept
- Easy to explore once have spectral ordering
- Compute at each cut point in $\mathrm{O}(\mathrm{N})$ time


## Spectral Ordering Option

- With iteration, can reweigh connections to change cost model being optimized
- linear
- (distance) $)^{1 . X}$
$C_{i, j}=\frac{1}{\sqrt{\left|X_{i}-X_{j}\right|}}$
$C_{i, j}\left(X_{i}-X_{j}\right)^{2}=\frac{\left(X_{i}-X_{j}\right)^{2}}{\sqrt{\left|X_{i}-X_{j}\right|}}=\left(X_{i}-X_{j}\right)^{15}$
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|  | $A$ | $B$ | $C$ | $G$ | $H$ | $O$ |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| $A$ | 1 |  |  | -1 |  |  |
| $B$ |  | 2 |  | -1 | -1 |  |
| $C$ |  |  | 1 |  | -1 |  |
| G | -1 | -1 |  | 3 |  | -1 |
| $H$ |  | -1 | -1 |  | 3 | -1 |
| O |  |  |  | -1 | -1 | 2 |

## Spectral Ordering

- Midpoint bisect isn't necessarily best place to cut, consider:


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## Fanout

- How do we treat fanout?

- As described assumes point-to-point nets
- For partitioning, pay price when cut something once
- I.e. the accounting did last time for KLFM
- Also a discrete optimization problem
- Hard to model analytically

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Spectral Fanout

- Typically:
- Treat all nodes on a single net as fully
connected
- Model links between all of them
- Weight connections so cutting in half counts
as cutting the wire - e.g. $1 /($ nodes 1 )
- Threshold out high fanout nodes
- If connect too many things give no information
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## Spectral Note

- Unlike KLFM, attacks global connectivity characteristics
- Good for finding "natural" clusters
- hence use as clustering heuristic for multilevel algorithms
- After doing spectral
- Can often improve incrementally using KLFM pass
- Remember spectral optimizing squared wirelength, not directly cut width


## Spectral Fanout Cut Approximation



Weight edges: $1 /(4-1)=1 / 3$


## Improving Spectral

## - More Eigenvalues <br> - look at clusters in n-d space

- But: 2 eigenvectors is not opt. solution to 2D placement
- Partition cut is plane in this higher-dimensional space
-5--70\% improvement over EIG1




## MaxFlow

- Set all edge flows to zero
- $\mathrm{F}[\mathrm{u}, \mathrm{v}]=0$
- While there is a path from s,t
- (breadth-first-search)
- for each edge in path $f[u, v]=f[u, v]+1$
- $f[v, u]=-f[u, v]$
- When $c[v, u]=f[v, u]$ remove edge from search
- O(|E|*cutsize)
- [Our problem simpler than general case CLR]



## MinCut Goal

- Find maximum flow (mincut) between a source and a sink
- no balance guarantee


## Technical Details

- For min-cut in graphs,
- Don't really care about directionality of cut
- Just want to minimize wire crossings
- Fanout
- Want to charge discretely ...cut or not cut
- Pick start and end nodes?




## Observation

- Can use residual flow from previous cut when computing next cuts
- Consequently, work of multiple network flows is only $\mathrm{O}\left(|E|^{*}\right.$ final_cut_cost)


## Picking Nodes

- Randomly pick
- (maybe try several starting points)
- With small number of adjacent nodes, - could afford to branch on all


## Extend to Balanced Cut

- Pick a start node and a finish node
- Compute min-cut start to finish
- If halves sufficiently balanced, done
- else
- collapse all nodes in smaller half into one node
- pick a node adjacent to smaller half
- collapse that node into smaller half
- repeat from min-cut computation

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## Picking Nodes

- Optimal:
- would look at all s,t pairs
- Just for first cut is merely N-1 "others"
- ...N/2 to guarantee something in second half
- Anything you pick must be in separate halves
- Assuming there is a perfect/ideal bisection
- If pick randomly, probability different halves: 50\%
-Few random selections likely to yield s,t in different halves
- would also look at all nodes to collapse into smaller
- could formulate as branching search

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## Big Ideas

- Divide-and-Conquer
- Techniques
- flow based
- numerical/linear-programming based
- Transformation constructs
- Exploit problems we can solve optimally
- Mincut
- Linear ordering

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## Admin

- Assign 3 due on Thursday
- Reading for Monday online
- Assignment 4 exercise out
- Should be small part
- Most effort on partitioning project

