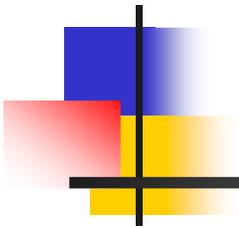


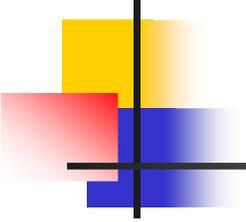
# Topics in Algorithms 2005

Constructing Well-Connected Networks  
via Linear Programming and Primal Dual Algorithms



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Ramesh Hariharan



# The Steiner Tree Problem: A Primal Dual Approach

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Given a subset  $S$  of vertices which need to be connected together, find the least cost connection.

$$\min \sum c_e x_e$$

for each cut splitting  $S$ :

$$\sum x_e \geq 1$$

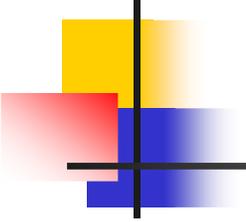
for each edge  $e$ :

$$0 \leq x_e$$

$$\max_{\{a_{\{S\}}\}} \sum_{\{S\}} a_{\{S\}}$$

$$\sum_{\{S, e \text{ crosses } S\}} a_{\{S\}} \leq c_e$$

$$a_{\{S\}} \geq 0$$



# The Primal Dual Approach

- Find feasible primal and dual solutions
- Dual Solution serves as a lower bound
- Primal Solution is integral and serves as the final answer

$$\min \sum c_e x_e$$

for each cut splitting  $S$ :

$$\sum x_e \geq 1$$

for each edge  $e$ :

$$0 \leq x_e$$

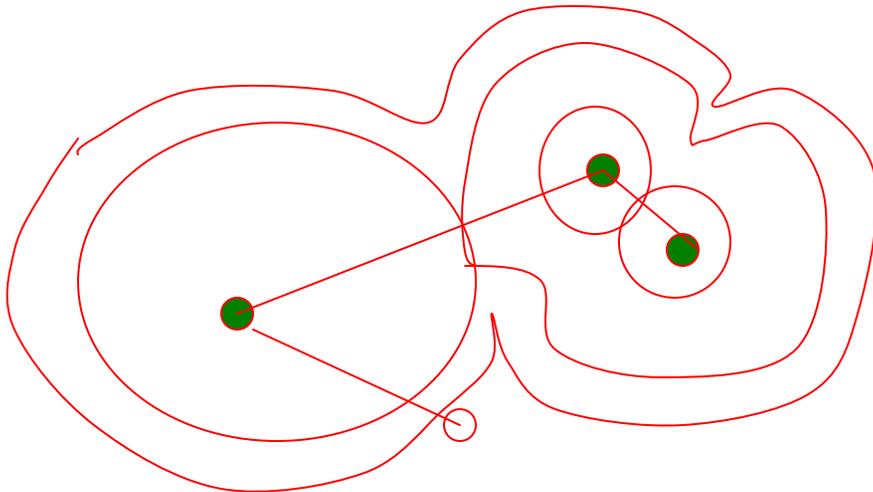
$$\max_{\{a_{\{S\}}\}} \sum_{\{S\}} a_{\{S\}}$$

$$\sum_{\{S, e \text{ crosses } S\}} a_{\{S\}} \leq c_e$$

$$a_{\{S\}} \geq 0$$

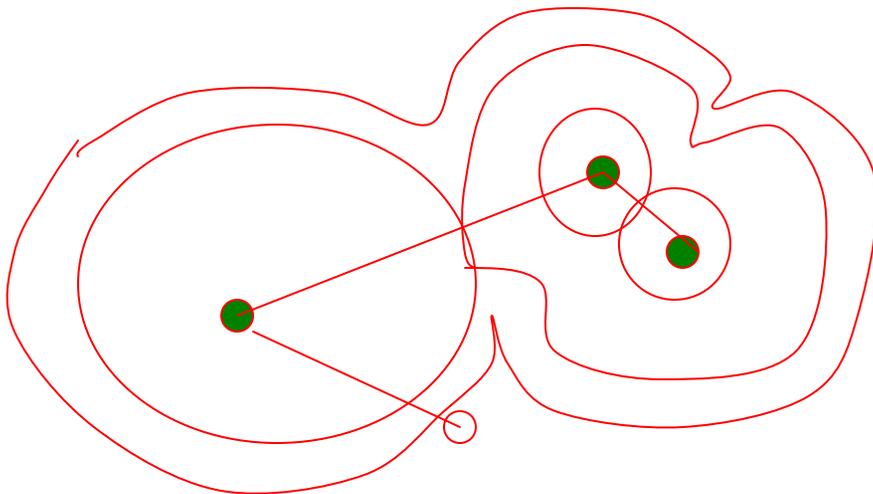
# Goemans-Williamson Ball Growing

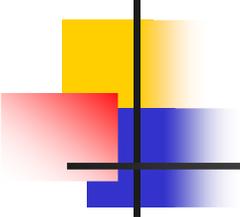
- Grow balls around each steiner vertex
- All balls grow at the same rate
- If two balls collide, they fuse and grow together after that
- The annulus width of a ball is the  $a_S$  value
- The total annuli sizes intersecting an edge do not exceed  $c_e$
- *Tight edges* form the primal integer solution (with some pruning)



# Goemans-Williamson Ball Growing

- Sum of annuli sizes is the dual solution, serves as a lower bound
- The primal solution has each annulus multiplied by the degree of that annulus
- Show that this is at most 2 times the sum of annuli sizes.





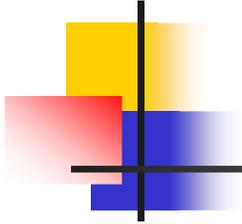
# The Generalized Steiner Network Problem

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Given a weighted graph  $G$  and a set of requirements, find a minimum cost subgraph satisfying these requirements

Requirements: For each subset  $S$  of vertices (i.e., a cut), how many edges  $f(S)$  must cross this cut

Kamal Jain shows a 2 factor approximation for this problem



# The Linear Program

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Select the least weight subset of edges satisfying all requirements

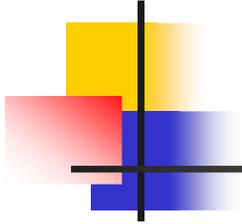
$$\min \sum c_e x_e$$

for each subset  $S$  of  $V$ :

$$\sum x_e \geq f(S)$$

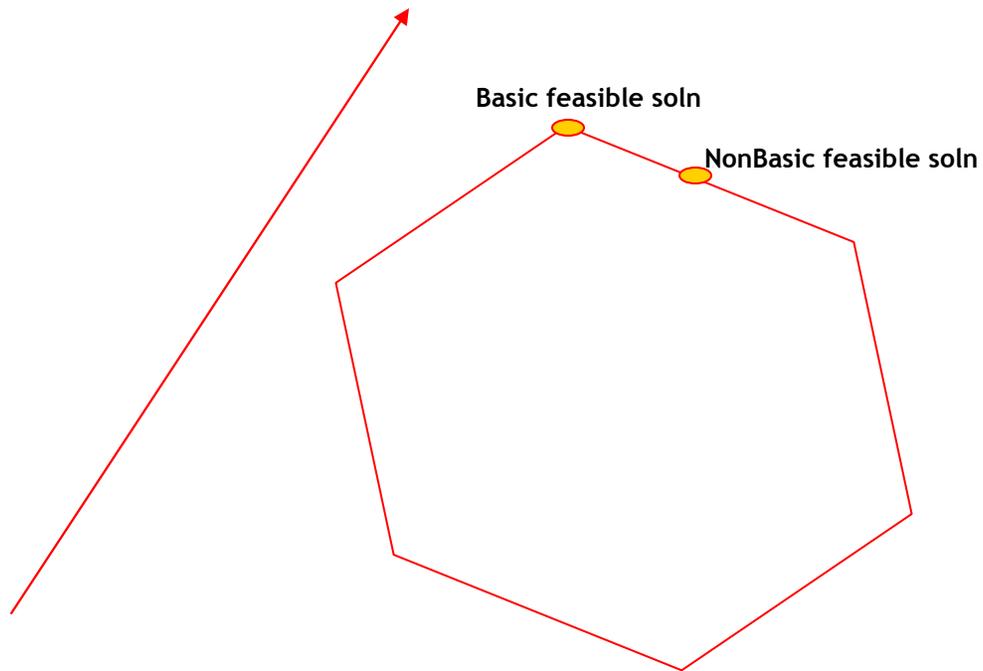
for each edge  $e$ :

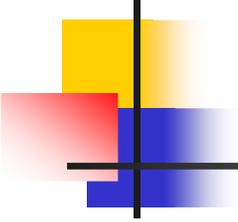
$$0 \leq x_e \leq 1$$



# Linear Programming

How does one solve a linear program? Later...





# Interpreting Linear Programming Results

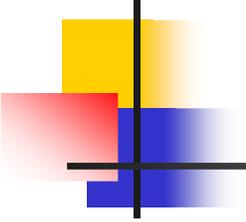
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How does one get a solution from the linear program results?

Problem:  $x_e$  need not be 0/1, could be fractional

**Claim: At least one  $x_e$  is at least .5 for basic feasible points**

- So What: Set this  $x_e$  to 1, remove all requirements satisfied in the process and recurse.
- How do we show that this results in a 2 factor approximation to the optimum?



# Rounding Effectiveness Proof

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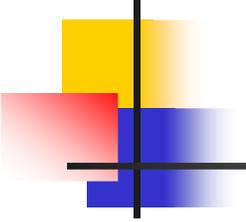
Obj Fn

rounded

unrounded

recursive

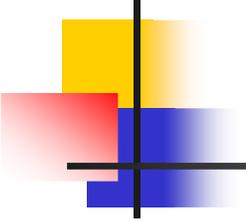
- The objective function value coming from the LP is a lower bound. Why?
- The recursive objective function value is at most the unrounded objective function value. Why??
- 2 factor follows. Why??



# Proving the claim

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- Based on tight set structure
- Tight Cuts: Cuts which have requirements exactly met
- 1. A,B are tight then
  - either  $A-B$  and  $B-A$  are tight  
 $A-B$  and  $B-A$  together have the same linear span as  $A,B$
  - or  $A \cap B$  and  $B \cup A$  are tight  
 $A \cap B$  and  $B \cup A$  together have the same linear span as  $A,B$
- Prove this??

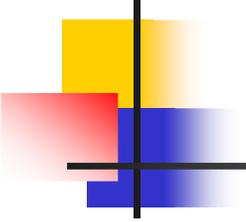


# Proving the claim

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Corollary:

- Consider any family of tight cuts
- This can be decomposed into a **laminar family** with the same linear span. Prove this??
- The laminar family can also be chosen to make the cuts in the family linearly independent
- The dimension of this linear span equals  $E'$ , the number of edges which get a fractional weight (i.e., non-0 weight, assuming no edge gets weight 1) ; **this assumes that the solution is a basic feasible solution (bfs)**
- It follows that the number of cuts in the laminar family equals  $E'$

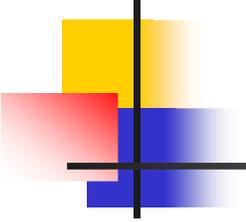


# Proving the claim

---

Show a  $1/3$  bound rather than  $1/2$  : show  $1/2$  as an exercise

- Consider only the  $E'$  edges with fractional non-1 weights in the analysis below
- If some cut in the family has at most 3 edges then done
- Otherwise, each cut has at least 4 edges
- Then show that the total count of edges is strictly greater than the number of cuts in the laminar family.

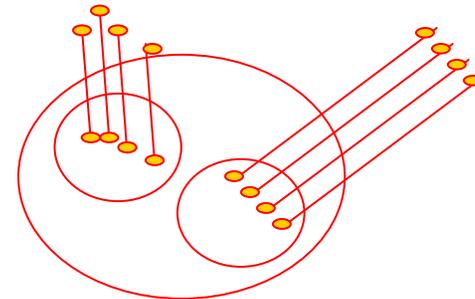


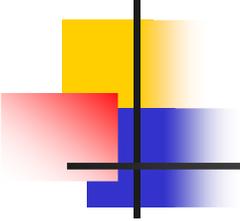
# Proving the claim

---

Show a  $1/3$  bound rather than  $1/2$  : show  $1/2$  as an exercise

- Then show that the total count of edges is strictly greater than the number of cuts in the laminar family.
- Show that the endpoints of the  $E'$  edges can be distributed such that each cut gets 2 endpoints and every maximal cut in the family gets 4 endpoints; why is this sufficient?
- Go bottom up on the cuts; leaves have 4 edges so they use two of the endpoints and send two upwards. Each cut with at least two child cuts gets 2 endpoints from each child, it uses two and send two upwards
- How about cuts with only one child cut?



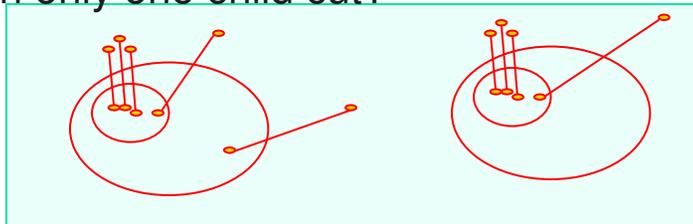
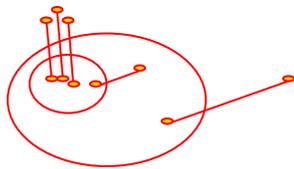


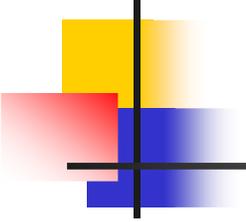
# Proving the claim

---

Show a  $1/3$  bound rather than  $1/2$  : show  $1/2$  as an exercise

- How about cuts with only one child cut?

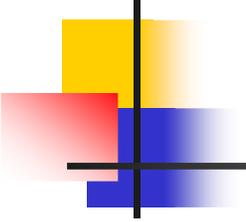




# Solving linear programs

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- Can be solved in polynomial time via Ellipsoid (expensive in practice) and Karmarkar's methods. Later..

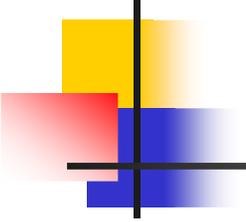


# Solving large linear programs

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- What if the number of constraints is very large: for instance, each vertex  $v$  wishes to be connected to some specified set of vertices with a certain number of paths
- Can still do polynomial time if we have the following procedure:

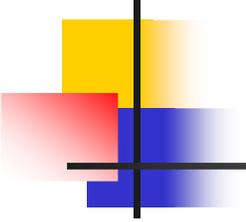
check if a given solution is feasible or not; if not show a violated constraint  
how does one do this?



# Open Problem

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- Linear programming is expensive, can we do without that to get a 2 factor approximation. Best known is goemans, williamson, vazirani, mihail, a not constant factor



# The Linear Program for the Generalized Steiner Problem

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Select the least weight subset of edges satisfying all requirements

$$\min \sum c_e x_e$$

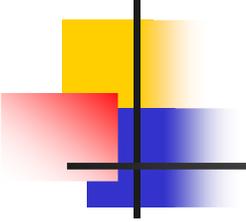
for each subset  $S$  of  $V$ :

$$\sum x_e \geq f(S)$$

for each edge  $e$ :

$$0 \leq x_e \leq 1$$

Exercise: Write the dual; Why does the ball growing approach not work. Where does it get stuck?



# References

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- Kamal Jain's paper on the generalized steiner network problem
- Goemans and Williamson's paper on the Steiner Tree problem
- Goemans, Williamson, Vazirani, Mahail on the Steiner Network Problem

All available on the web