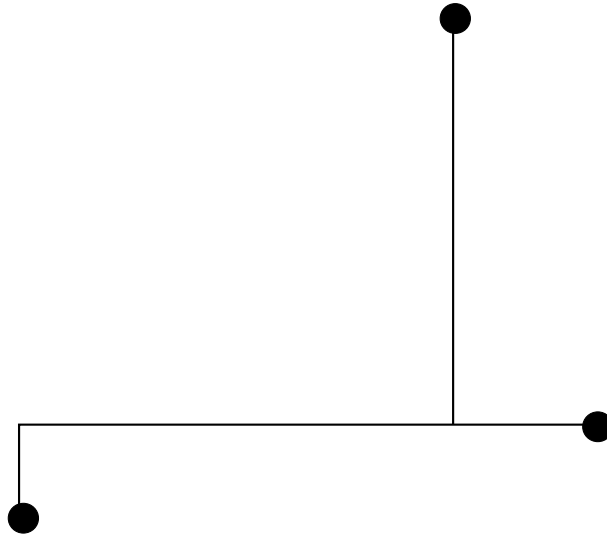


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# Rectilinear Steiner Trees in the Plane

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## Outline

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- Structural Properties
  - The Hanan Grid
  - Hwang-topology Full Steiner Trees (FSTs)
  - The Steiner Ratio
- FST Based Exact Algorithms
  - FST Generation
  - FST Concatenation
- Heuristics
- Delay-Optimal Rectilinear Steiner Trees
- Secondary Objectives for RSMTs

## The Rectilinear Steiner Tree Problem in the Plane

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- Definition: Given a set  $Z$  of terminals in the plane find a shortest interconnection of the terminals using the  $L_1$  metric, i.e., only horizontal and vertical lines may be used.
- Complexity: **NP**-hard [Garey & Johnson, 1977].
- Approximation: Has a polynomial-time approximation scheme [Arora, 1996].
- Exact algorithms:

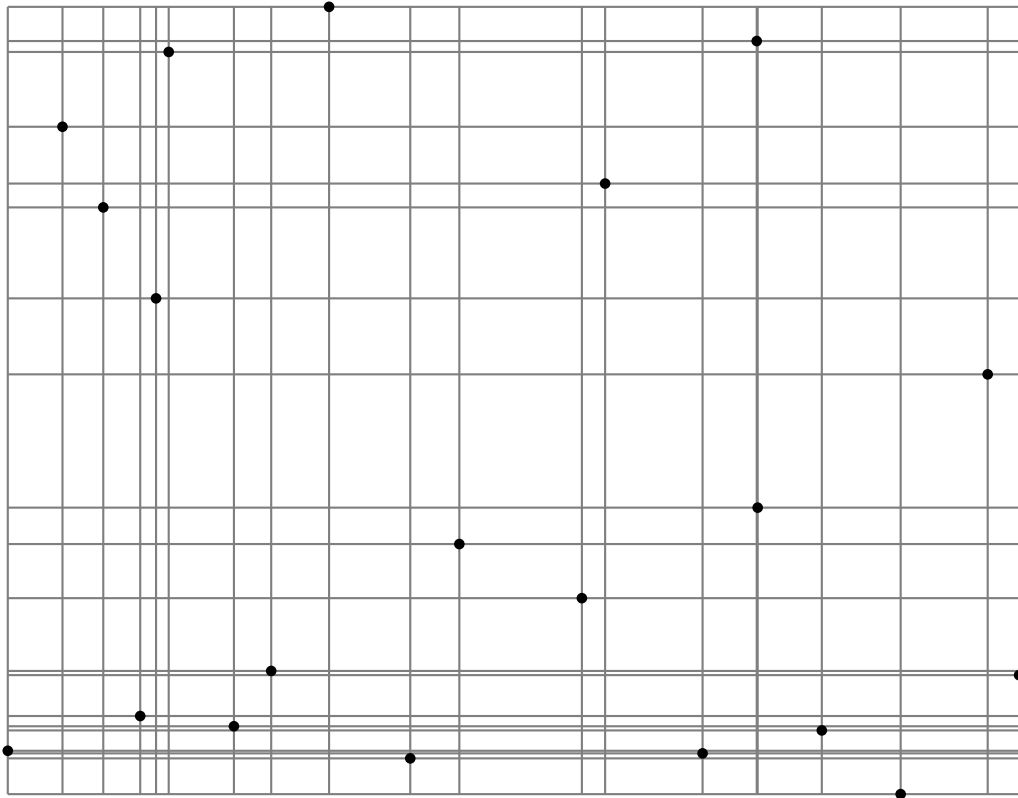
[Yang & Wing, 1972]	10
[Ganley & Cohoon, 1994]	20
[Salowe & Warme, 1995]	35
[Warme, 1997]	1000
[Warme & Zachariasen, 2000]	10000

- Applications: VLSI design, printed circuit board layout etc.

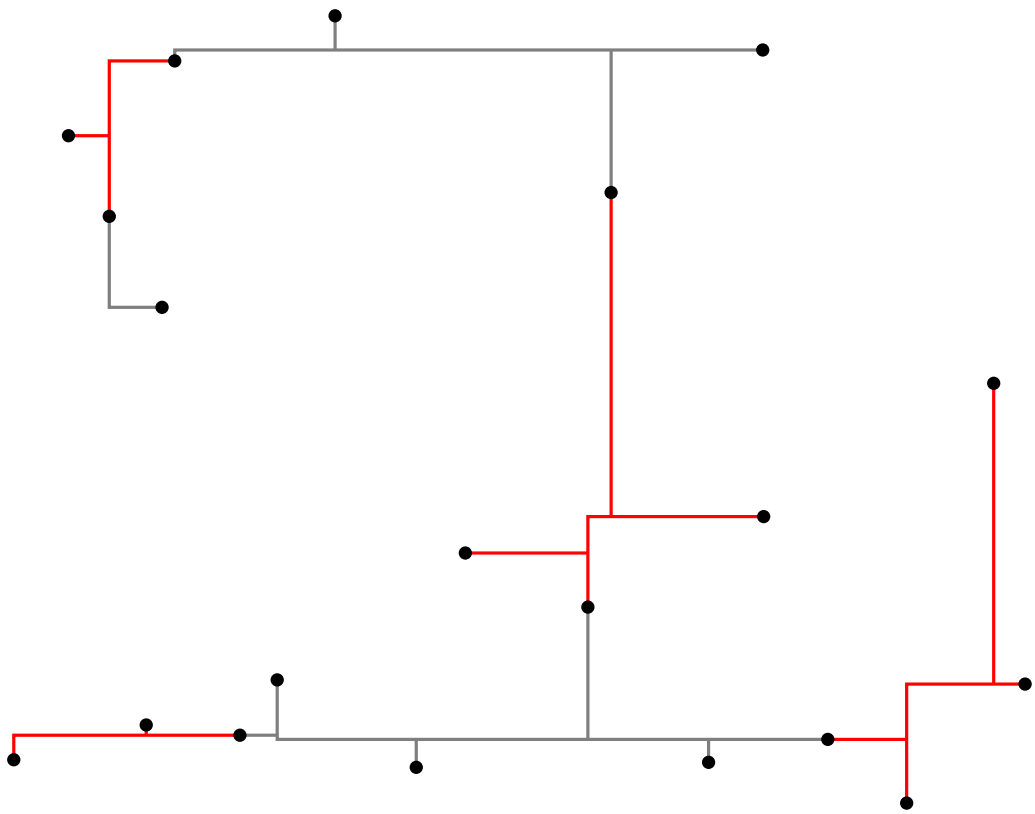
## The Hanan Grid

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- The Steiner points for a rectilinear Steiner minimum tree (RSMT) may be confined to the vertices of the grid graph for  $Z$  [Hanan, 1966].



- A *full Steiner tree (FST)* is a Steiner tree in which all terminals are leaves. An RSMT is a union of FSTs.



4-a

## Fulsome and Canonical RSMTs

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### Fulsome RSMT

The number of FSTs is maximized. In particular, no FST can be split into two or more FSTs.

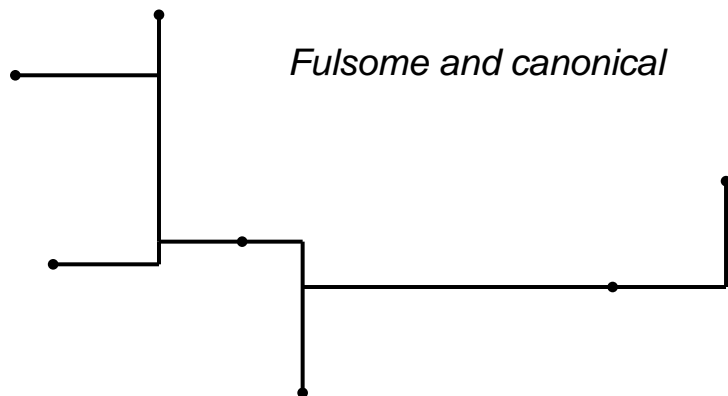
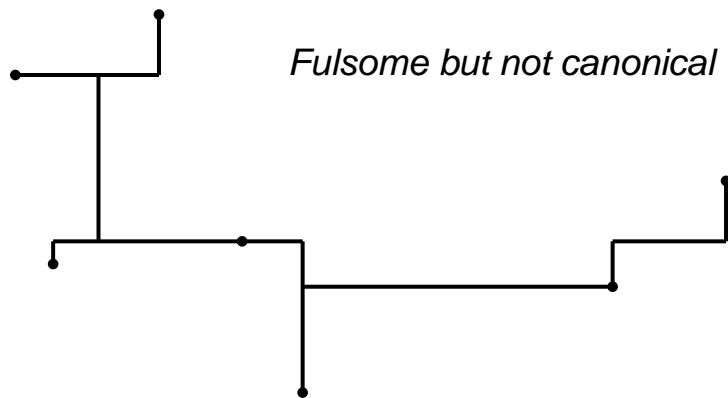
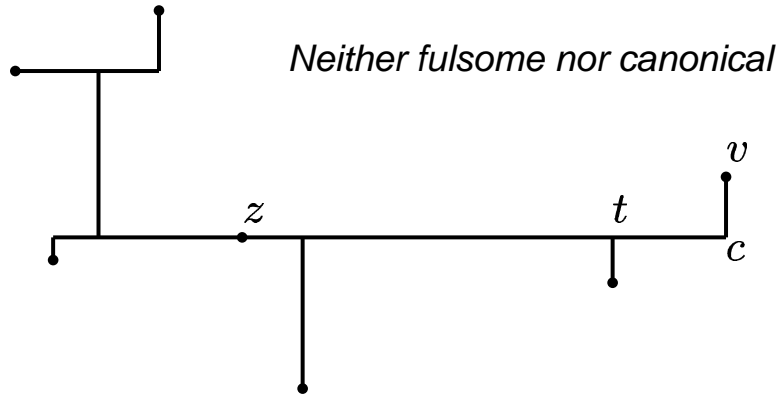
### Canonical RSMT

No vertical segment can be moved to the right using **sliding** and/or **flipping** operations.



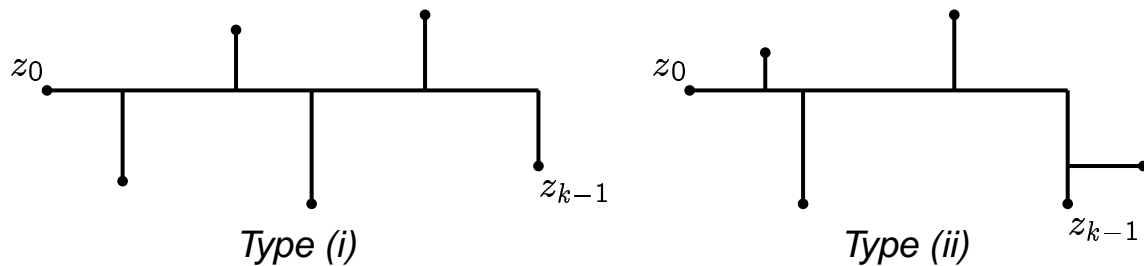
## Fulsome and Canonical RSMTs - An Example

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## Hwang-topology FSTs

- An FST has one of two generic forms [Hwang, 1976]:



- An FST spanning  $k$  terminals consists of a corner given by a **root**  $z_0$  and a **tip**  $z_{k-1}$ . The root is incident to the *long* leg and tip incident to the *short* leg of the corner.
- **Type (i)** has  $k - 2$  alternating segments incident to the long leg and no segment incident to the short leg.
- **Type (ii)** has  $k - 3$  alternating segments incident to the long leg and one segment incident to the short leg.
- Degenerate cases:
  - Type (i') has a zero-length short leg, i.e., the corner is degenerated into a line.
  - Type (i'') is a cross spanning exactly four terminals (the two alternating incident segments are on the same line).

## The Steiner Ratio

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For a given set of terminals  $Z$ :

$|RSMT(Z)|$ : Length of RSMT for  $Z$

$|RMST(Z)|$ : Length of a minimum spanning tree for  $Z$  under the  $L_1$  metric

Steiner ratio for the  $L_1$  metric in the plane:

$$\rho_1 = \inf_Z \frac{|RSMT(Z)|}{|RMST(Z)|}$$

**Theorem** [Hwang, 1976]  $\rho_1 = \frac{2}{3}$

## FST Based Exact Algorithm

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- Phase 1: **FST Generation**
  - Generate a set  $\mathcal{F} = \{F_1, F_2, \dots, F_m\}$  of FSTs such that there exists an RSMT identified as a subset  $\mathcal{F}^* \subseteq \mathcal{F}$ .
  - The first rectilinear FST-generation algorithm was suggested by [Salowe & Warme, 1995]; improved algorithm given by [Zachariasen, 1999].
- Phase 2: **FST Concatenation**
  - Find a subset  $\mathcal{F}^* \subseteq \mathcal{F}$  such that the FSTs in  $\mathcal{F}^*$  interconnect all terminals and the total length is as small as possible. Not metric dependent.
  - Equivalent to solving a minimum spanning tree problem in a hypergraph.
  - Can be formulated as an integer program which is solved by linear program relaxation and branch-and-cut [Warme, 1997].

## Necessary Optimality Conditions

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The *bottleneck Steiner distance*,  $BSD(z_i, z_j)$ , between two terminals  $z_i$  and  $z_j$  is equal to the length of the longest edge on the (unique) path between  $z_i$  and  $z_j$  in  $RMST(Z)$ .

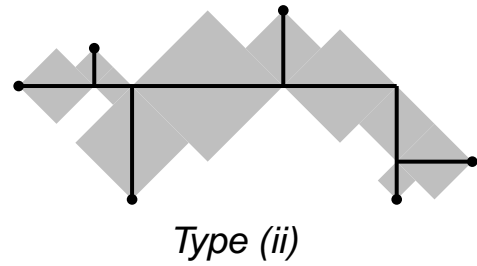
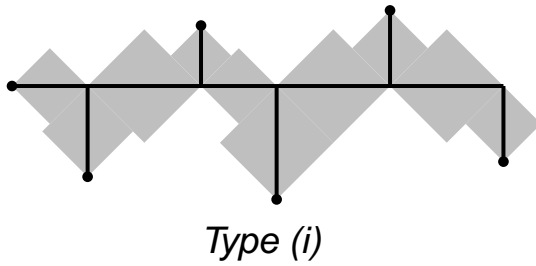
Let  $F$  be an FST with length  $|F|$  spanning  $Z_F \subseteq Z$ . Assume that  $F$  is a subtree of an RSMT spanning  $Z$ .

1.  $F$  is an RSMT for  $Z_F$ . Furthermore we may assume that there exist no union of smaller FSTs spanning  $Z_F$  and having total length  $|F|$ .
2. Let  $z_i, z_j \in Z_F$ . The longest edge on the (unique) path between  $z_i$  and  $z_j$  in  $F$  cannot be longer than  $BSD(z_i, z_j)$ .
3.  $|F|$  cannot be greater than the length of an MST for  $Z_F$  using distances  $BSD(z_i, z_j)$  between every pair of terminals.

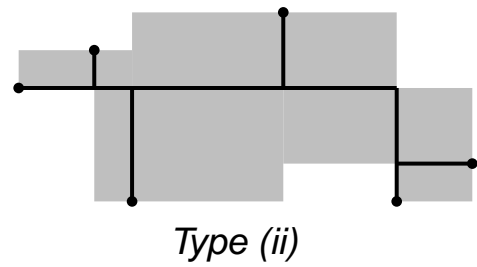
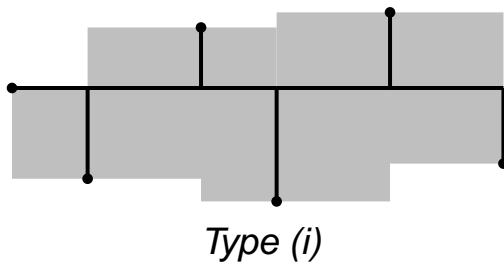
# Empty Regions

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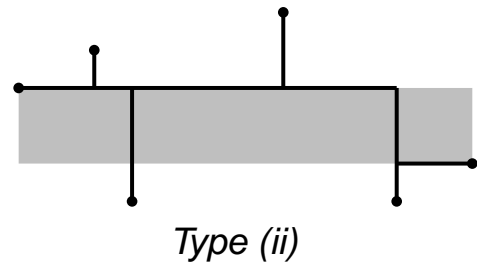
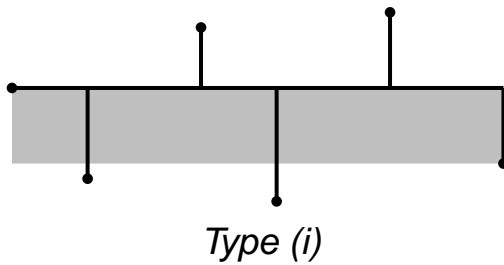
- Empty diamonds



- Empty corner rectangles

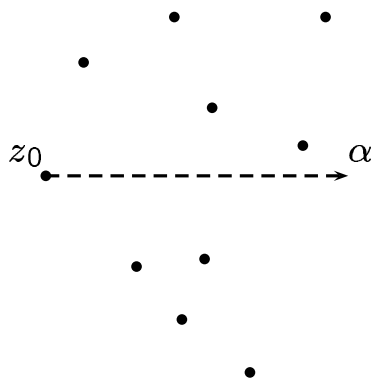


- Empty inner rectangle

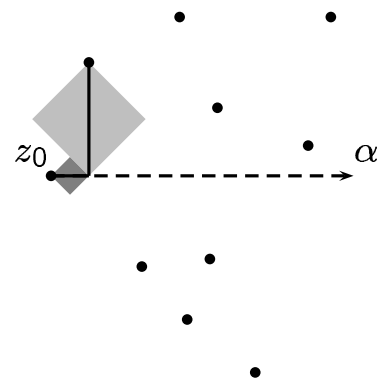


## Growing Rectilinear FSTs

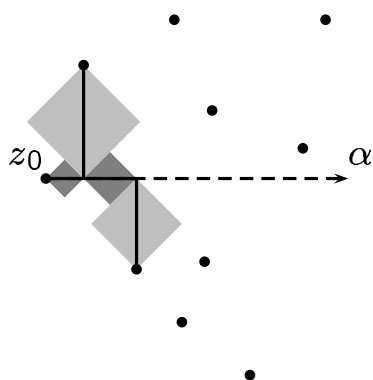
For every terminal  $z_0 \in Z$  and direction  $\alpha \in \{North, East\}$  try to *grow* an FST with  $z_0$  as root and having its long leg oriented in direction  $\alpha$ .



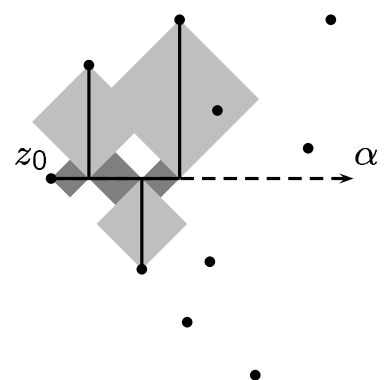
Root and direction



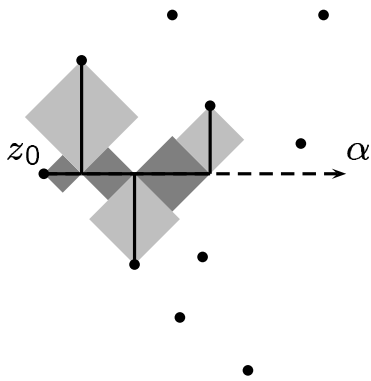
Save and recurse



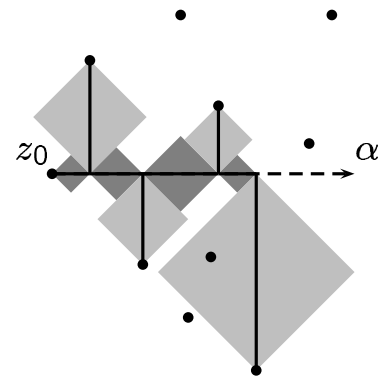
Save and recurse



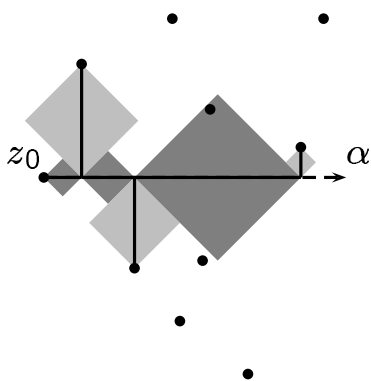
Skip and continue



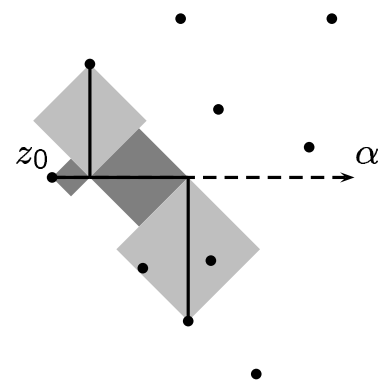
Save and recurse



Backtrack



Backtrack



Skip and continue...

By performing FST-independent *preprocessing* the number of long leg candidates for every  $(z_0, \alpha)$  pair can be reduced and efficient pruning can be applied.

## Bounds on the Number of FSTs

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Crucial question: How many FSTs survive in the generation phase?

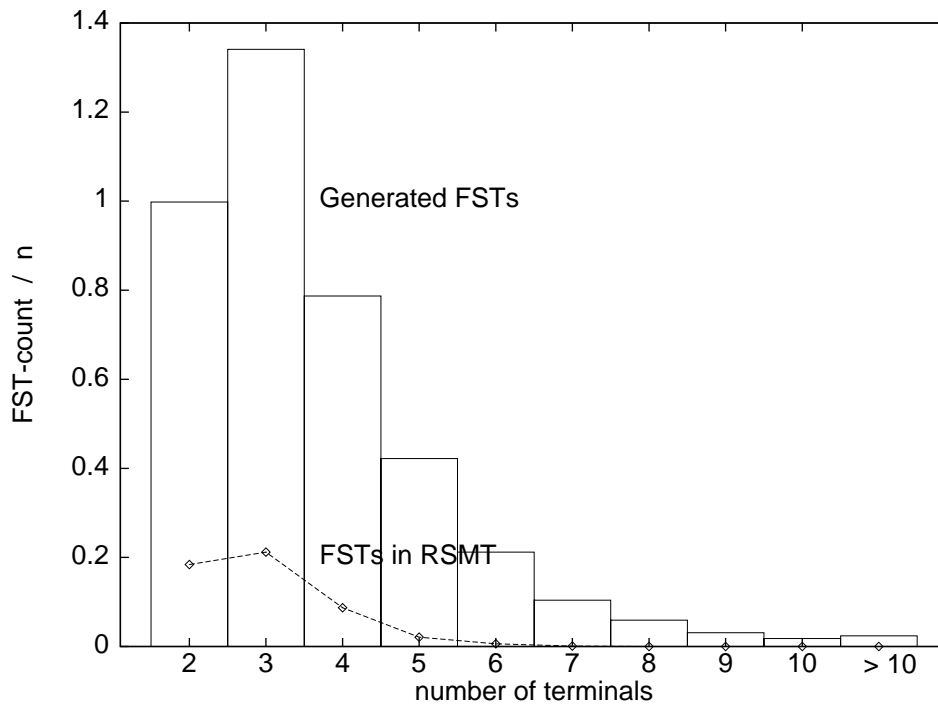
- Empirically only a linear number of FSTs survive (approximately  $4n$  for the rectilinear problem).
- The best worst-case bound for the rectilinear problem is exponential and “tight” in a certain sense [Fößmeier & Kaufmann, 1996].
- For randomly generated instances the *expected* number of rectilinear FSTs spanning up to  $K$  terminals is bounded by

$$O(n(\log \log n)^{K-2})$$

where  $K \geq 3$  is a constant.

## FST-size Distribution

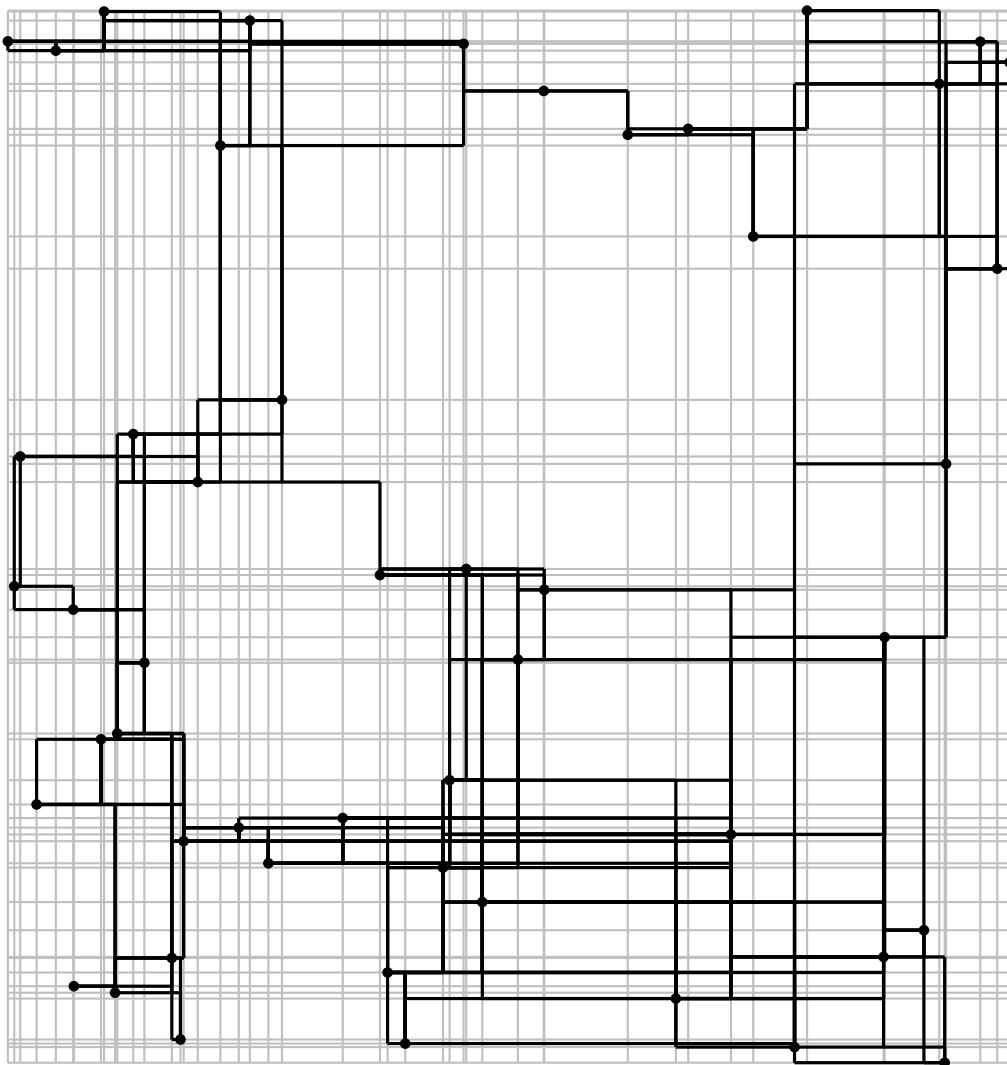
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## Hanan Grid Graph Reduction by FST Generation

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FST generation can be used as a grid graph reduction algorithm by overlaying the generated FSTs on the Hanan grid.



## FST Concatenation

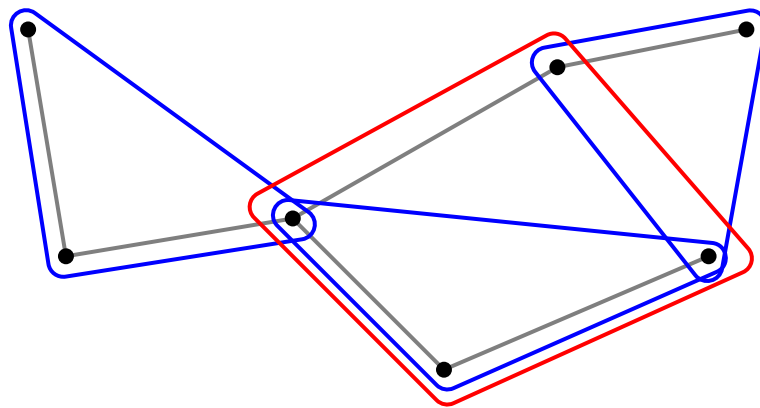
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- Given a set  $\mathcal{F} = \{F_1, F_2, \dots, F_m\}$  find a subset  $\mathcal{F}^* \subseteq \mathcal{F}$  such that the FSTs in  $\mathcal{F}^*$  interconnect all terminals and the resulting tree is as short as possible.
- Can be solved using backtrack search, dynamic programming or integer programming.
- Equivalent to finding an MST in the (edge-weighted) *hypergraph*  $(Z, \mathcal{F})$ ; terminals are vertices in the graph and FSTs *hyperedges*.
- The general MST in hypergraph problem is **NP**-hard when there are hyperedges spanning four or more terminals.

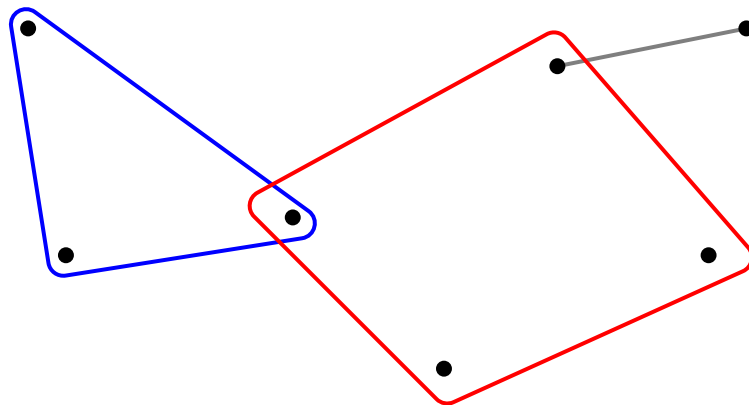
## The Spanning Tree in Hypergraph Problem

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Hypergraph example



Spanning tree example



There should be a *unique chain* between every pair of vertices.

## FST Concatenation by Integer Programming

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- For each FST  $F_i \in \mathcal{F}$  let
  - $Z_i$  be the set of terminals spanned by  $F_i$
  - $c_i$  be the length of  $F_i$
  - $x_i \in \{0, 1\}$  be a binary variable such that  $x_i = 1$  if and only if  $F_i \in \mathcal{F}^*$ .
- For any subset  $S \subset Z$ ,  $S \neq \emptyset$  denote by
$$(S : Z \setminus S) \subseteq \{1, \dots, m\}$$
the indices of FSTs spanning terminals in both  $S$  and  $Z \setminus S$ .
- Connectivity can be enforced by requiring that

$$\sum_{i \in (S : Z \setminus S)} x_i \geq 1, \quad \forall S \subset Z$$

## Integer Programming Formulation

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$$\min cx \tag{1}$$

$$\text{s.t.} \quad \sum_{i \in \{1, \dots, m\}} (|Z_i| - 1)x_i = n - 1 \tag{2}$$

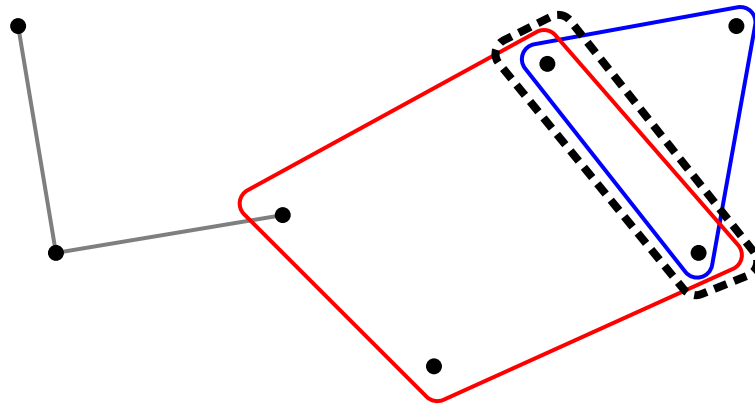
$$\sum_{i \in \{1, \dots, m\}} \max(0, |Z_i \cap S| - 1)x_i \leq |S| - 1, \quad \forall S \subset Z, |S| \geq 2 \tag{3}$$

- Equation (2) enforces the right number and cardinality of hyperedges to construct a spanning tree; constraints (3) eliminate cycles.
- Together these constraints dominate the cutset-constraints, that is, ensure that the solution is a spanning hypertree.

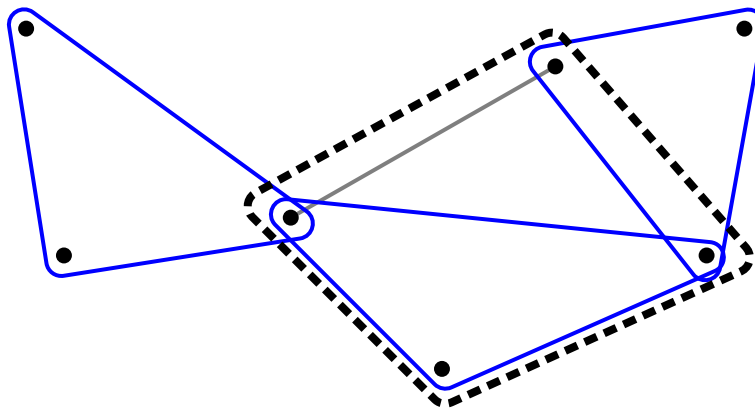
## Cycle-Elimination Constraints

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Example with  $|S| = 2$



Example with  $|S| = 4$



## Solving the IP Formulation

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- The integer program is solved via branch-and-cut using a linear program relaxation. Cycle-elimination constraints (3) are added via iterations of optimization followed by separation.

- Initial polyhedron:

$$\sum_{i \in \{1, \dots, m\}} (|Z_i| - 1)x_i = n - 1$$

$$\sum_{i \in \{1, \dots, m\}} \max(0, |Z_i \cap S| - 1)x_i \leq |S| - 1, \quad \forall S \subset Z, |S| = 2$$

$$\sum_{i \in (\{z\}:Z \setminus \{z\})} x_i \geq 1, \quad \forall z \in Z$$

$$x_i + x_j \leq 1, \quad F_i \text{ incompatible with } F_j$$

$$0 \leq x_i \leq 1, \quad i \in \{1, \dots, m\}$$

- Cycle-elimination constraints are separated by finding a minimum cut in a certain graph (e.g., by solving a maximum flow problem).

## Heuristics

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Most heuristics first compute an MST for  $Z$  — and then try iteratively (in a greedy manner) to improve this tree:

- iterative embedding
- Steinerization
- Delaunay triangulation-based
- iterative 1-Steiner heuristic

Other approaches:

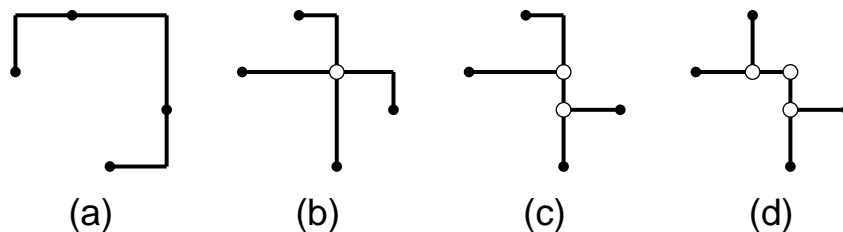
- Prim- and Kruskal-based plane sweep
- partitioning
- Arora's PTAS

## Iterated 1-Steiner Heuristic

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1.  $V = Z$ ; compute  $RMST(V)$
2. Find a point  $s$  such that  $|RMST(V \cup \{s\})|$  is minimized.
3. if  $|RMST(V \cup \{s\})| < |RMST(V)|$  then set  $V = V \cup \{s\}$  and goto 2; otherwise stop

Step 2 can be performed in  $O(n^2)$  time by partitioning the plane into *isodendral regions*.



## Delay-Optimal Rectilinear Trees

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Electrical signal originates from one of the given terminals denoted the **source**  $r \in Z$ .

Signal **delay** from  $r$  to some other terminal  $z_i \in Z$  in a tree  $T$  depends on:

- total length of  $T$
- length  $|rz_i|_T$  of path from  $r$  to  $z_i$  in  $T$
- topology of  $T$

For a **given** tree  $T$  the delay can be computed quite accurately using simulation tools, e.g., SPICE.

Reasonable delay-approximation: Elmore delay function

## Elmore Delay Function - Definitions

---

For every terminal  $z_i$  we are given:

$c_{z_i}$ : capacitance of  $z_i$  (what is the load of  $z_i$ ?)

$r_d$ : on-resistance of the output driver at the source  
(how powerful is the driver?)

For a given node  $v$  in a tree  $T$  define:

$e_v$ : edge from  $v$  to parent in  $T$

$r_{e_v}$ : resistance of edge  $e_v$  (linear in length of edge)

$c_{e_v}$ : capacitance of edge  $e_v$  (linear in length of edge)

$T_v$ : subtree rooted at  $v$

$C_v$ : capacitance of  $T_v$   
(sum of terminal and edge capacitances)

$r_{e_v} \left( \frac{c_{e_v}}{2} + C_v \right)$ : **Elmore delay** of edge  $e_v$

## Elmore Delay Function

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Elmore delay at terminal  $z_i \in Z$ :

$$t_{ED}(z_i) = r_d C_r + \sum_{e_v \in p_T(r, z_i)} r_{e_v} \left( \frac{C_{e_v}}{2} + C_v \right)$$

Typical objectives:

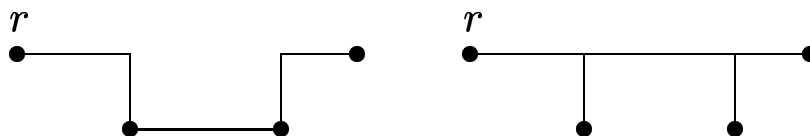
- minimize maximum delay over all terminals
- minimize weighted delay of the terminals

## Secondary Objectives for RSMTs

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Among all RSMTs for  $Z$ , minimize a **secondary objective** related to the signal delay from the source, e.g.,

- Maximum path length
- Weighted path length
- Maximum Elmore delay
- Weighted Elmore delay



## Weighted Path Length Secondary Objective

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Define for tree  $T$ :

- $|rz_i|_T$ : length of path from  $r$  to  $z_i$  in  $T$
- $w_i$ : positive weight for terminal  $z_i \in Z \setminus \{r\}$

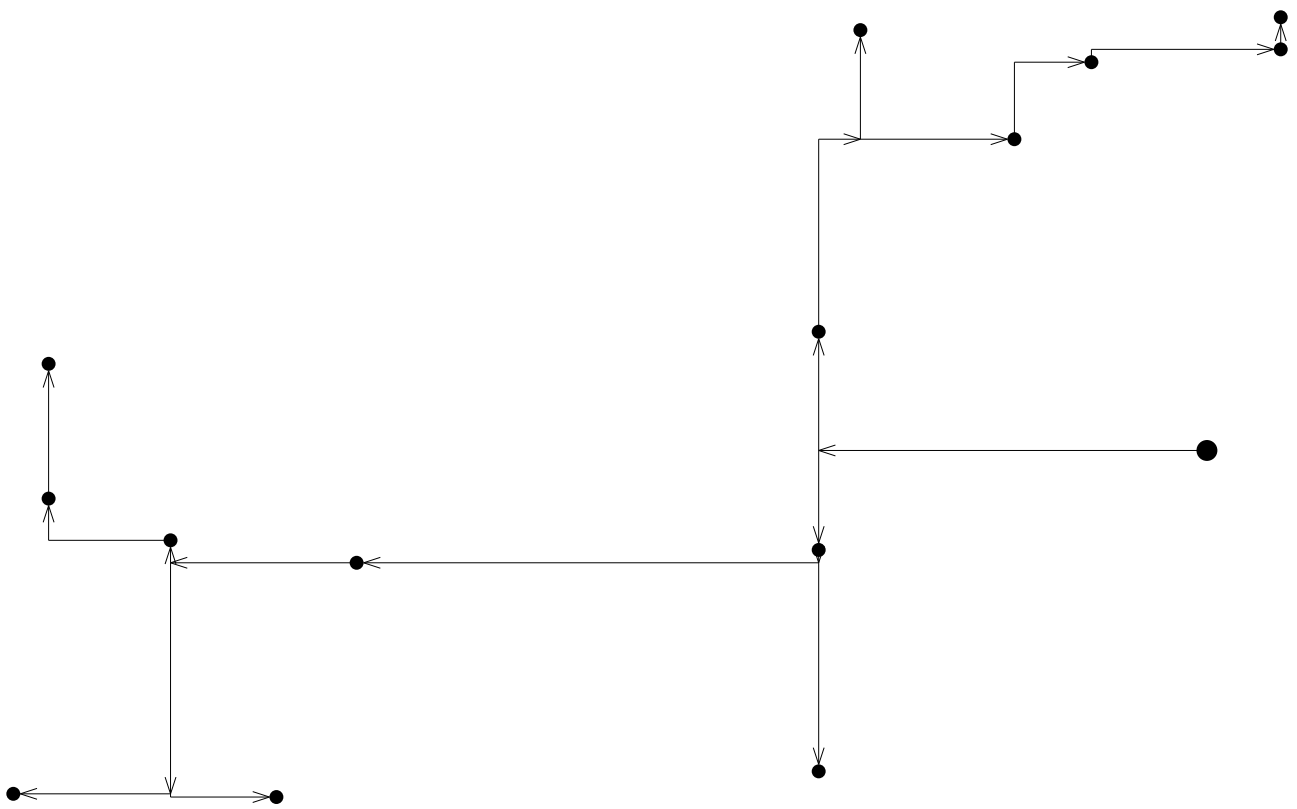
Rectilinear Steiner tree problem with weighted sum of path lengths secondary objective (RSTPWP):

Construct an RSMT  $T$  such that

$$\sum_{z_i \in Z \setminus \{r\}} w_i |rz_i|_T$$

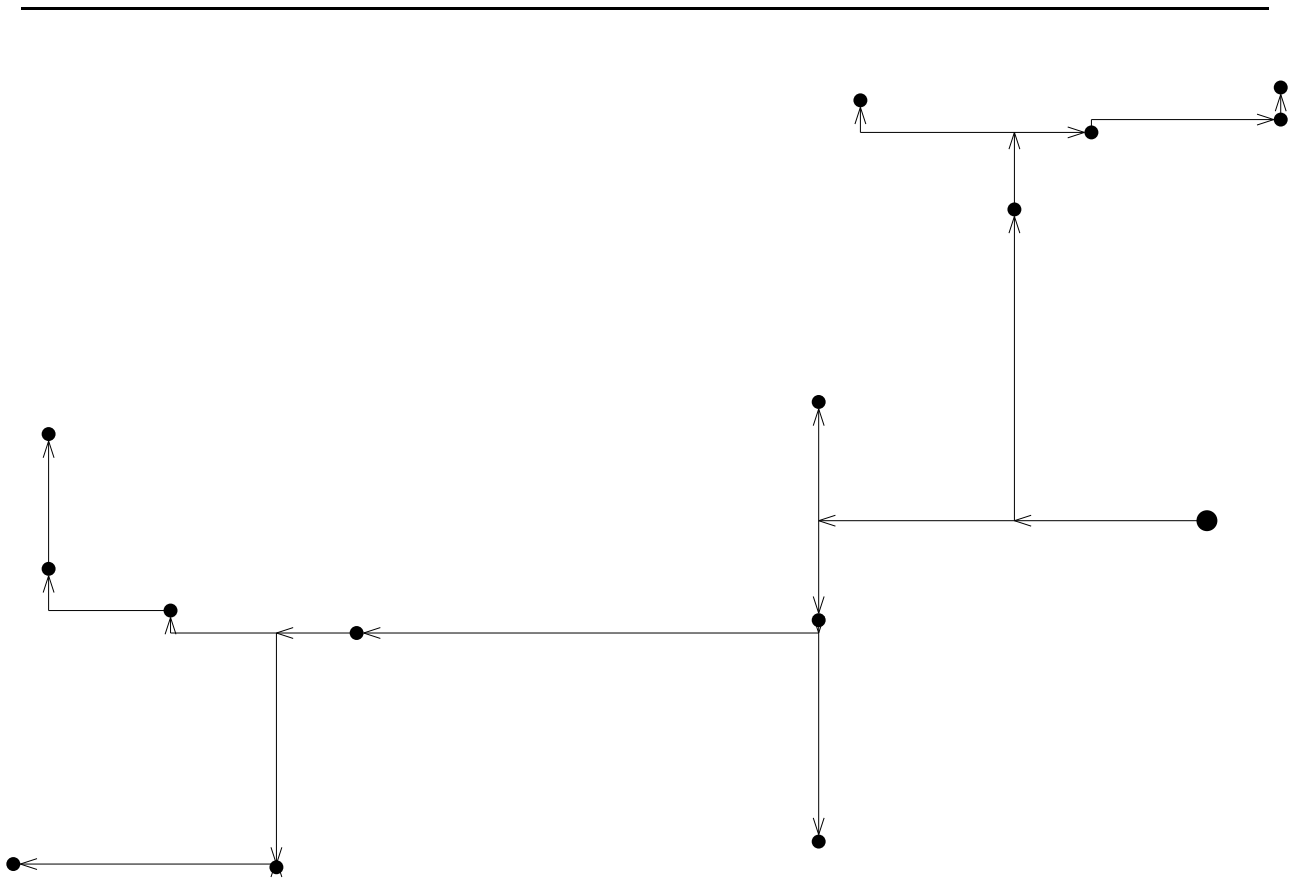
is minimized.

# An RSMT



Tree length: 991 Total path length: 4674

## Optimal Solution to RSTPWP



Tree length: 991    Total path length: 4094

Union of *directed* full Steiner trees

## Exact Algorithm for RSTPWP

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Optimal solution has to be in [Hanan grid](#) for  $Z$ .

Consider edge-weighted directed Hanan grid graph  $G = (V, E)$ .  
Two decision variables defined for each edge  $(u, v) \in E$ :

- $x_{uv} \in \{0, 1\}$  indicates whether the edge is chosen to be part of the Steiner tree
- $f_{uv} \geq 0$  is amount of flow traversing the edge

## Integer Programming Formulation

---

$$\begin{aligned}
 & \min \sum_{(u,v) \in E} c_{uv} (x_{uv} + f_{uv}) \\
 \text{s.t.} \quad & \sum_{(u,v) \in \delta(S)} x_{uv} \geq 1, \quad \forall S \subset V, r \in S, (V \setminus S) \cap Z \neq \emptyset \\
 & \sum_{(u,v) \in E} f_{uv} - \sum_{(v,u) \in E} f_{vu} = D_v, \quad \forall v \in V \setminus \{r\} \\
 & f_{uv} \leq x_{uv}, \quad \forall (u,v) \in E \\
 & x_{uv} \in \{0, 1\}, \quad \forall (u,v) \in E \\
 & f_{uv} \geq 0, \quad \forall (u,v) \in E
 \end{aligned}$$

$$\delta(S) := \{(u,v) \in E : u \in S \wedge v \in V \setminus S\}$$

Similar to directed formulation for the Steiner tree problem in graphs; added flow measures secondary objective.

$D_{z_i} := w_i / (CW)$  where  $C$  is an upper bound on any path length and  $W := \sum_{z_i \in Z \setminus \{r\}} w_i$ ;  
 $D_v := 0$  for  $v \in V \setminus Z$ .