

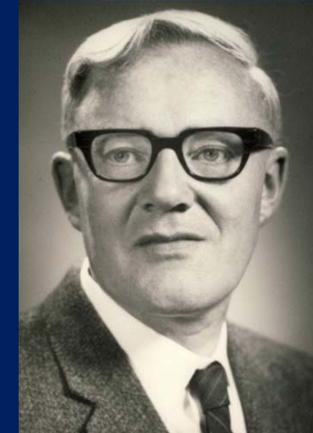
# How to Draw a Graph ... Revisited

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## W. T. Tutte 1917 - 2002

- Code breaker at Bletchley park
- Pioneer of matroid theory
- Pioneer of graph theory
- Inventor of the first graph drawing algorithm
  - His 1963 paper “*How to Draw a Graph*” \* has inspired much research



This talk is about two strands of Graph Drawing research that followed Tutte's work

\* William T. Tutte. “How to draw a graph.” *Proc. London Math. Society*, 13(52):743 -768, 1963.

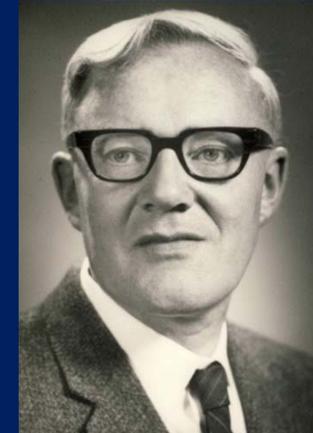
## This talk

### 1. Background

- a) Graphs
- b) Graph drawings
- c) Connectivity
- d) Planar graphs
- e) Topological embedding
- f) Good graph drawings

### 2. How to draw a graph?

- a) Before Tutte: 1920s – 1950s
- b) Tutte: 1960s
- c) After Tutte: 1970s – 1990s
- d) Recent work



(a) Graphs

A graph consists of

- Nodes, and
- Binary relationships called “edges” between the nodes

Example: a “Linked-In” style social network

Nodes:

- Alice, Andrea, Annie, Amelia, Bob, Brian, Bernard, Boyle

Edges

- Bob is connected to Alice
- Bob is connected to Andrea
- Bob is connected to Amelia
- Brian is connected to Alice
- Brian is connected to Andrea
- Brian is connected to Amelia
- Boyle is connected to Alice
- Boyle is connected to Andrea
- Boyle is connected to Annie
- Bernard is connected to Alice
- Bernard is connected to Andrea
- Bernard is connected to Annie

(b) Graph drawing

## Graph

A graph consists of

- Nodes, and
- Edges



## Graph Drawing

A graph drawing is a picture of a graph.

That is, a graph drawing is a mapping that assigns

- a location for each node, and
- a curve to each edge.

A social network

Nodes:

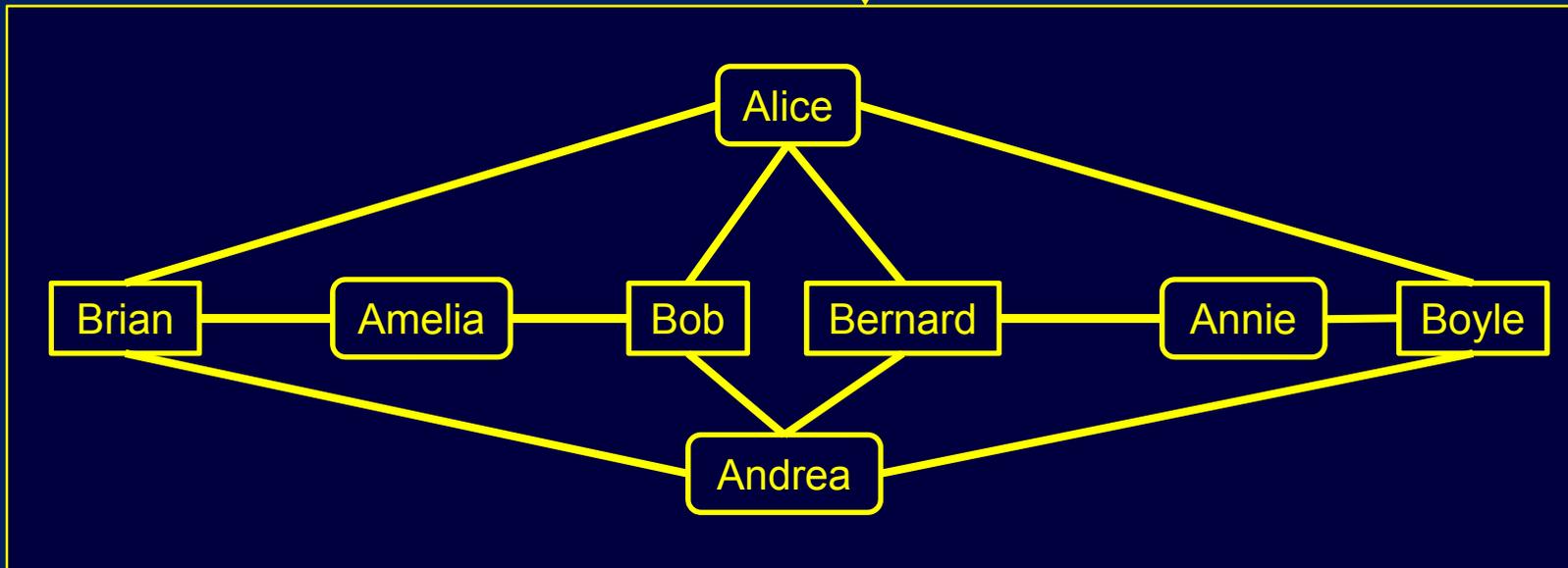
- Bob, Brian, Bernard, Boyle, Alice, Andrea, Annie, Amelia

Edges

- Bob is connected to Alice
- Bob is connected to Andrea
- Bob is connected to Amelia
- Brian is connected to Alice
- Brian is connected to Andrea
- Brian is connected to Amelia
- Boyle is connected to Alice
- Boyle is connected to Andrea
- Boyle is connected to Annie
- Bernard is connected to Alice
- Bernard is connected to Andrea
- Bernard is connected to Annie



A drawing of the social network

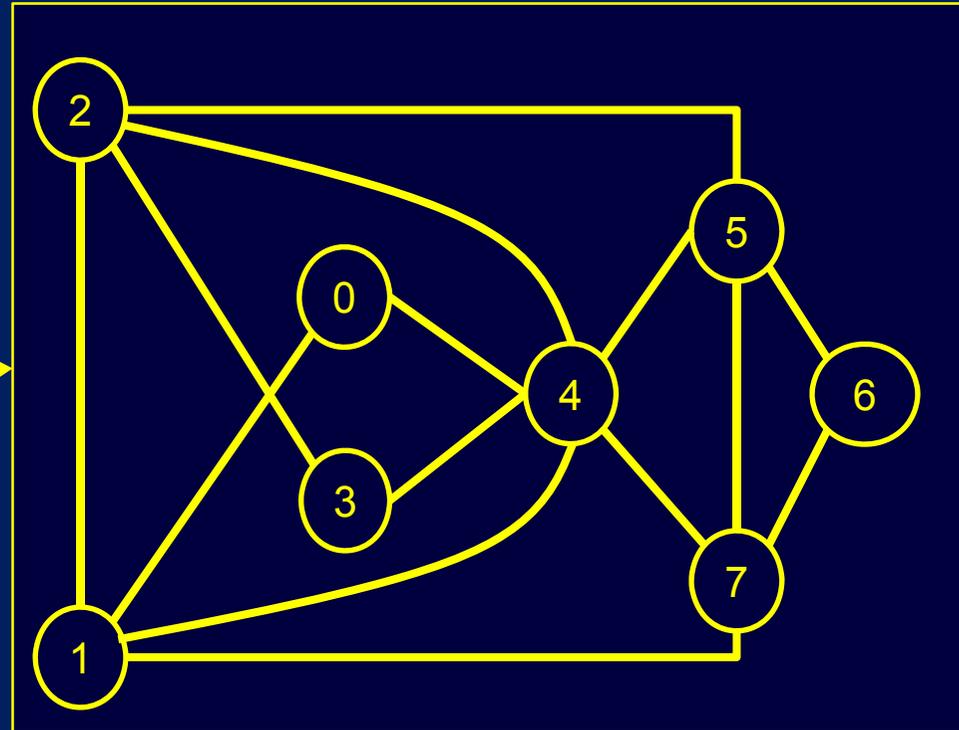


Nodes

0, 1, 2, 3, 4, 5, 6, 7

Edges

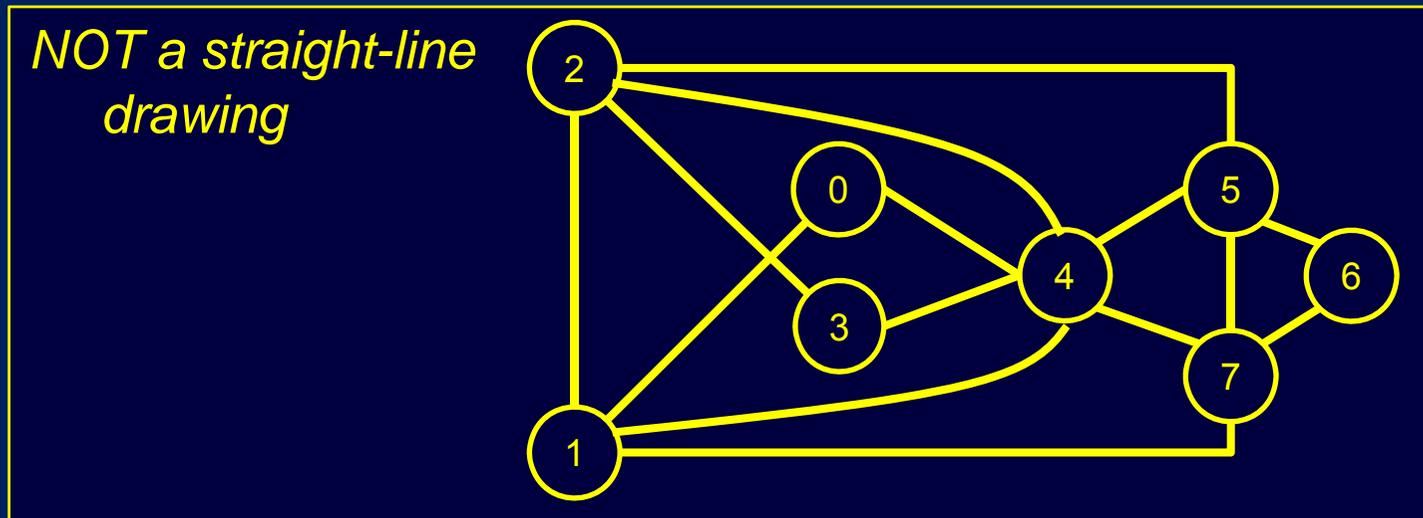
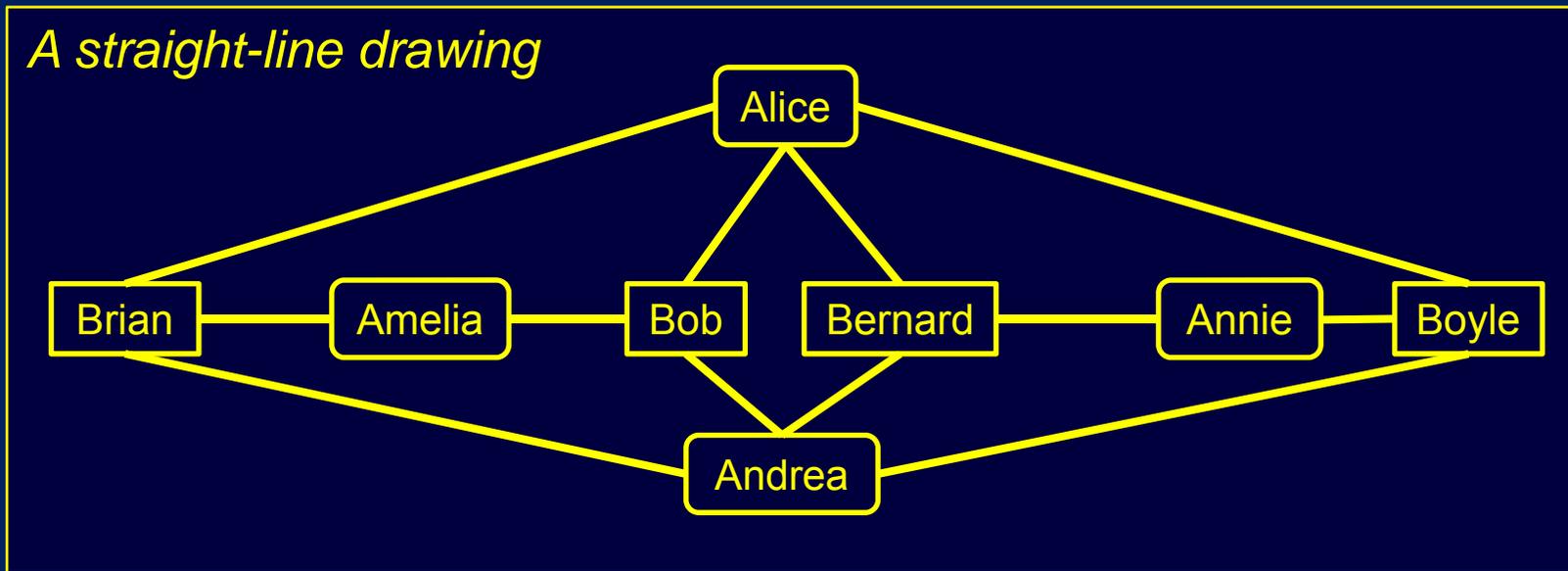
0 - 1  
0 - 4  
1 - 2  
1 - 4  
1 - 7  
2 - 3  
2 - 4  
2 - 5  
3 - 4  
4 - 5  
4 - 7  
5 - 6  
5 - 7  
6 - 7



A drawing of the graph

A graph

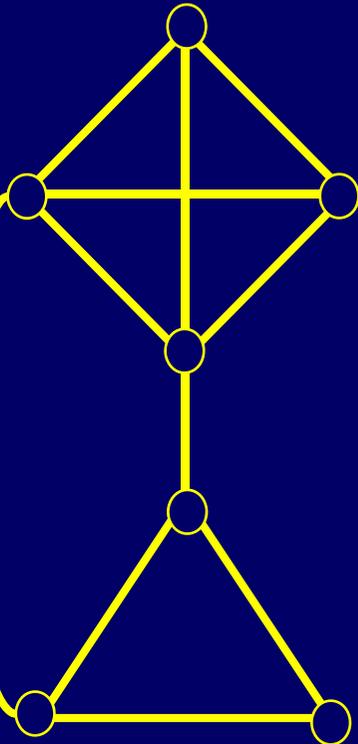
A graph drawing is a straight-line drawing if every edge is a straight line segment.



(c) Connectivity

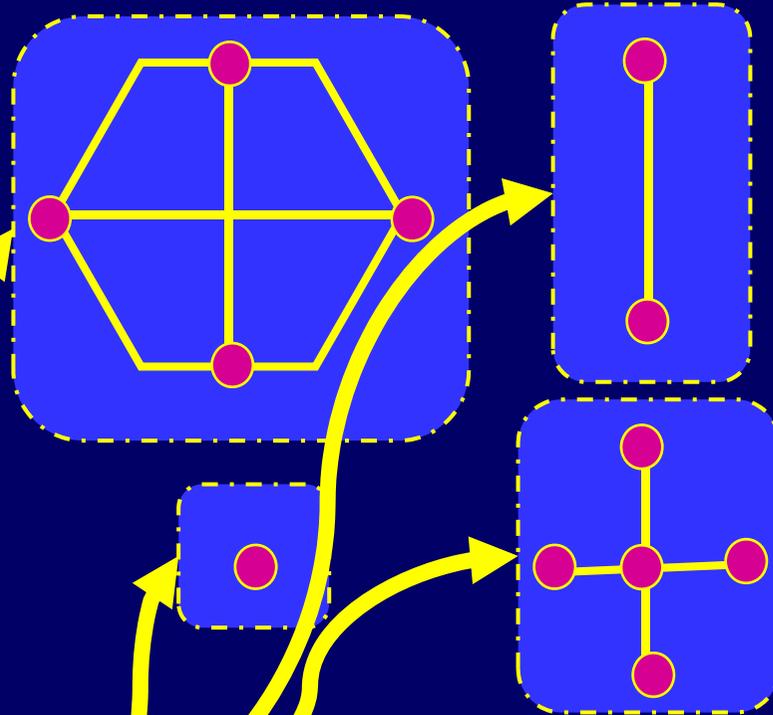
Connectivity notions are fundamental in any study of graphs or networks

- A graph is connected if for every pair  $u, v$  of vertices, there is a path between  $u$  and  $v$ .
- A graph is  $k$ -connected if there is no set of  $(k-1)$  vertices whose deletion disconnects the graph.
  - $k = 1$ : “1-connected”  $\equiv$  “connected”
  - $k = 2$ : “2-connected”  $\equiv$  “biconnected”
  - $k = 3$ : “3-connected”  $\equiv$  “triconnected”



This graph is connected

Connected components



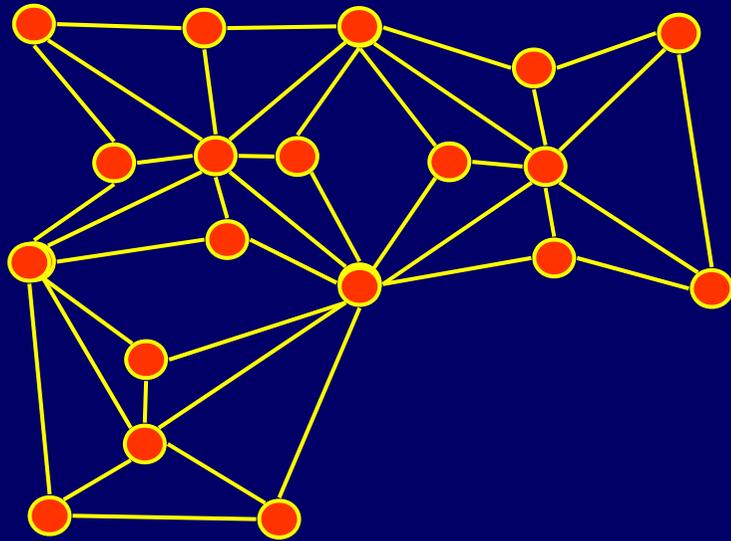
This graph is not connected

## Connectivity notions are fundamental in any study of networks

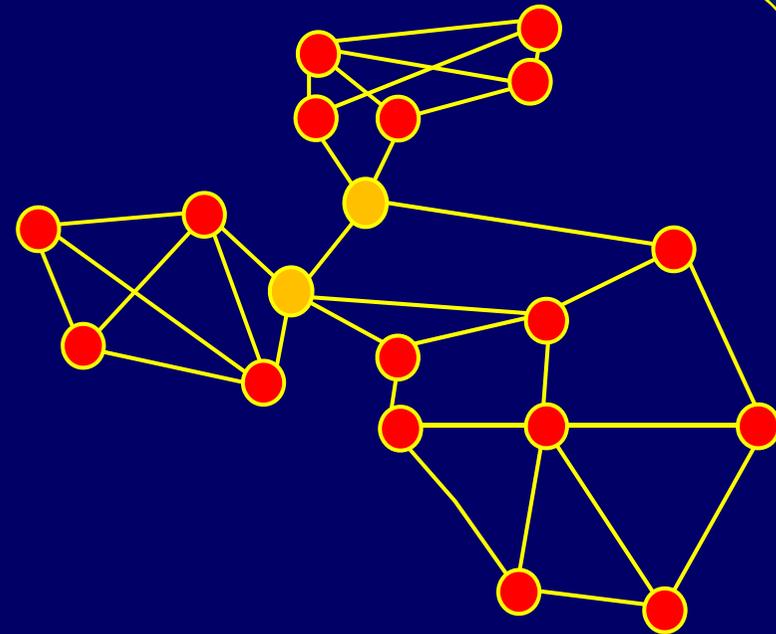
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  - $k = 3$ : “3-connected”  $\equiv$  “triconnected”

“2-connected”  $\equiv$  “biconnected”

- A cutvertex is a vertex whose removal would disconnect the graph.
- A graph without cutvertices is biconnected.



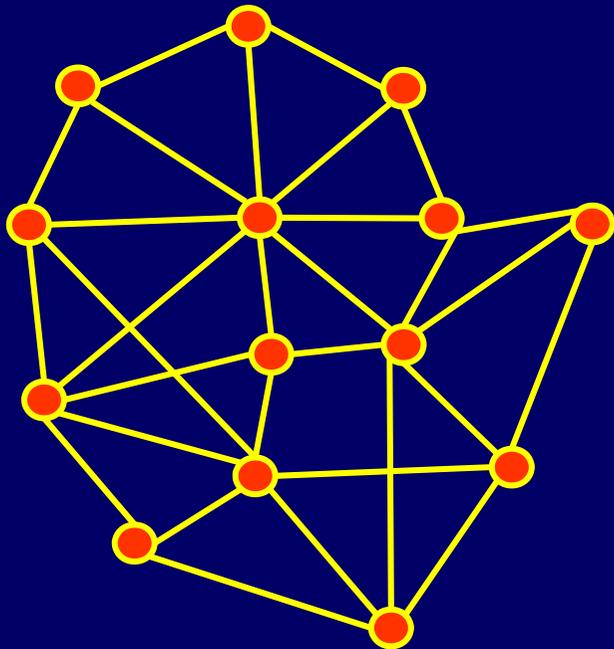
This graph is biconnected



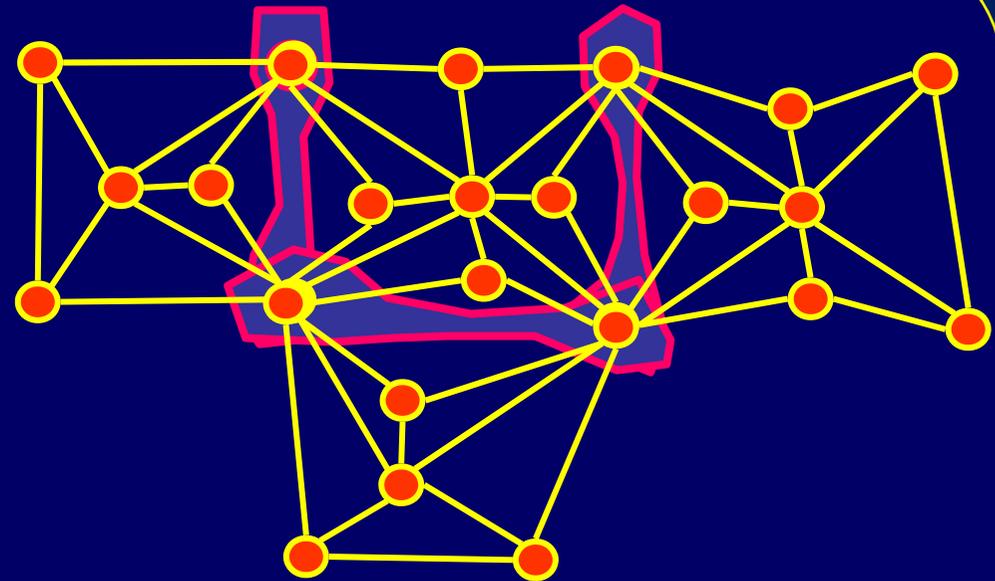
This graph is not biconnected

“3-connected”  $\equiv$  “triconnected”

- A separation pair is a pair of vertices whose removal would disconnect the graph.
- A graph without separation pairs is triconnected.



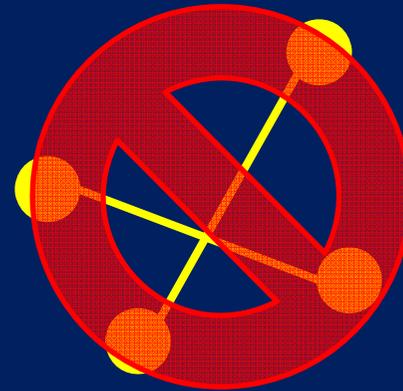
This graph is triconnected



This graph is not triconnected

(d) Planar graphs

A graph is planar if it can be drawn without edge crossings.



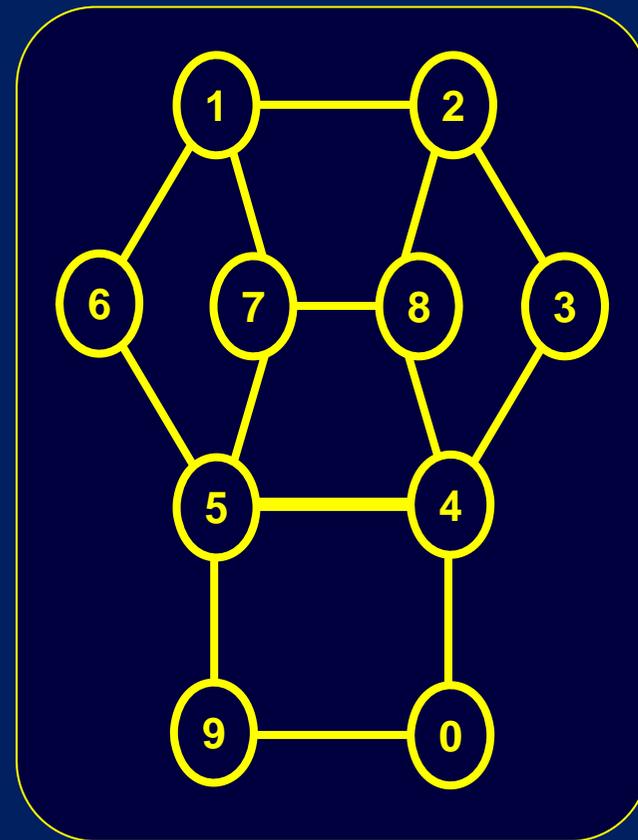
A graph is *planar* if it can be drawn without edge crossings.

Nodes:

- 0,1,2,3,4,5,6,7,8,9

Edges

- 0 – 4
- 0 – 9
- 1 – 2
- 1 – 6
- 1 – 7
- 2 – 3
- 2 – 8
- 3 – 4
- 4 – 5
- 4 – 8
- 5 – 6
- 5 – 7
- 7 – 8



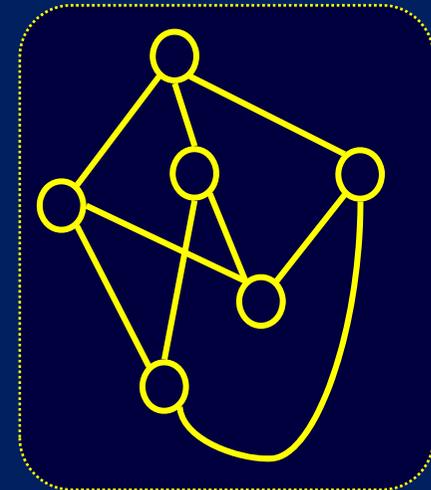
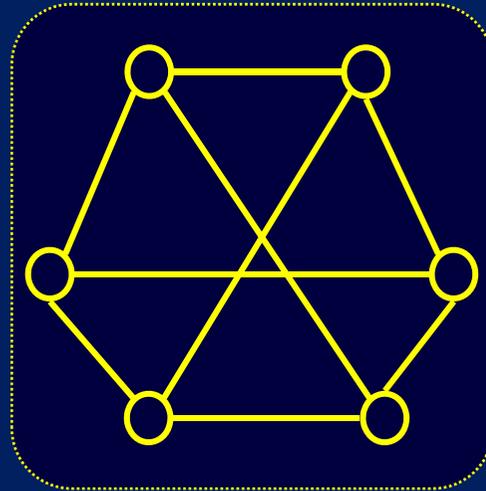
*Non-planar*

Nodes:

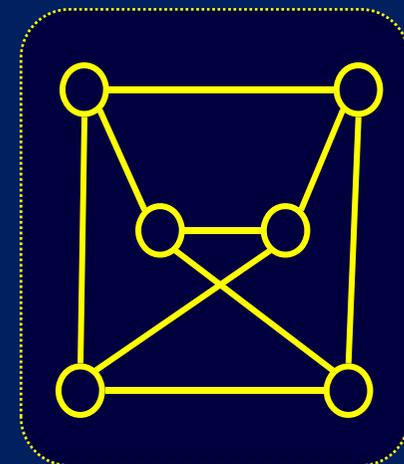
- 0,1,2,3,4,5

Edges

- 0 – 1
- 0 – 3
- 0 – 5
- 1 – 2
- 1 – 4
- 2 – 3
- 2 – 5
- 3 – 4
- 4 – 5

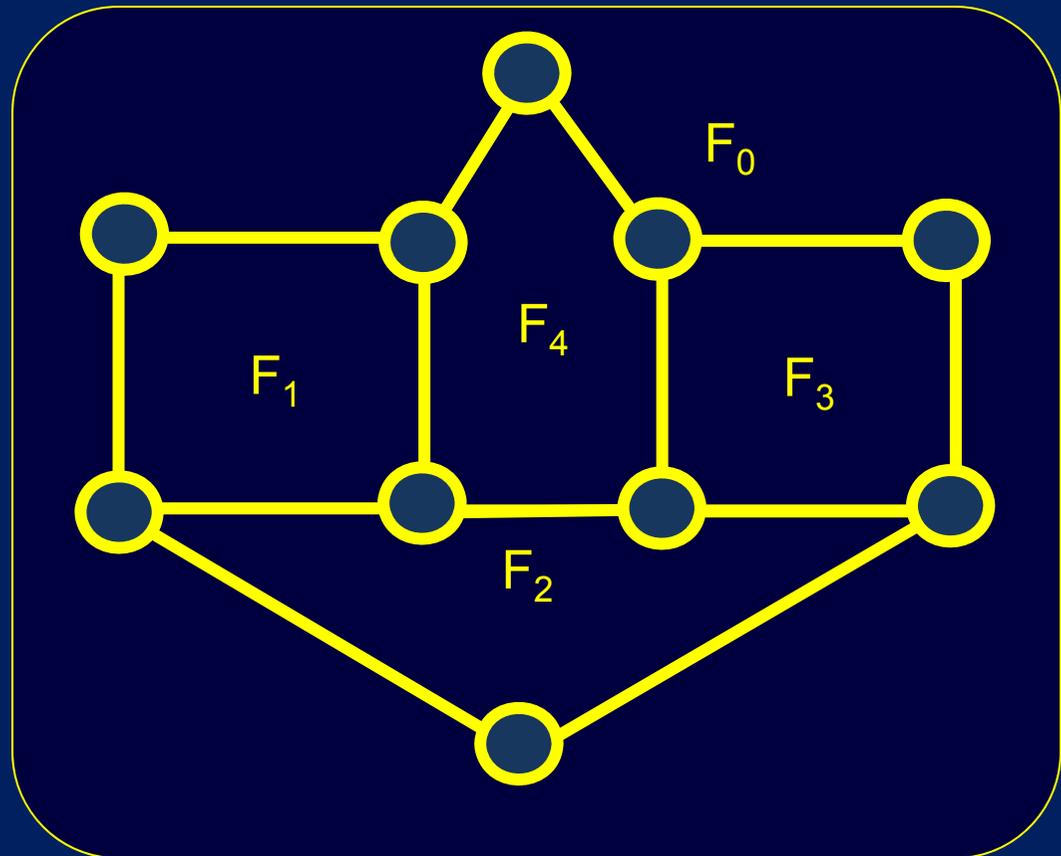


A graph is non-planar if every drawing has at least one edge crossing.



(e) Topological embedding

A planar drawing divides the plane into faces.



$F_0$  shares a boundary with  $F_1$   
 $F_0$  shares a boundary with  $F_2$   
 $F_0$  shares a boundary with  $F_3$   
 $F_0$  shares a boundary with  $F_4$   
 $F_1$  shares a boundary with  $F_2$   
 $F_1$  shares a boundary with  $F_4$   
 $F_2$  shares a boundary with  $F_1$   
 $F_2$  shares a boundary with  $F_3$   
 $F_2$  shares a boundary with  $F_4$   
 $F_3$  shares a boundary with  $F_4$

The boundary-sharing relationships of the faces defines a topological embedding of the graph drawing

Graph

- Nodes and edges
- No geometry

Topological embedding

- Faces and incidence between faces
- “Rubber sheet” geometry
- Equivalence under homeomorphism

Graph Drawing

- A picture of the graph
- Points and curves
- Geometry fully specified

*Most of this talk is about the mapping from a topological embedding to a graph drawing*



### Euler formula

If

$$n = \text{\#vertices}$$

$$f = \text{\#faces}$$

$$m = \text{\#edges}$$

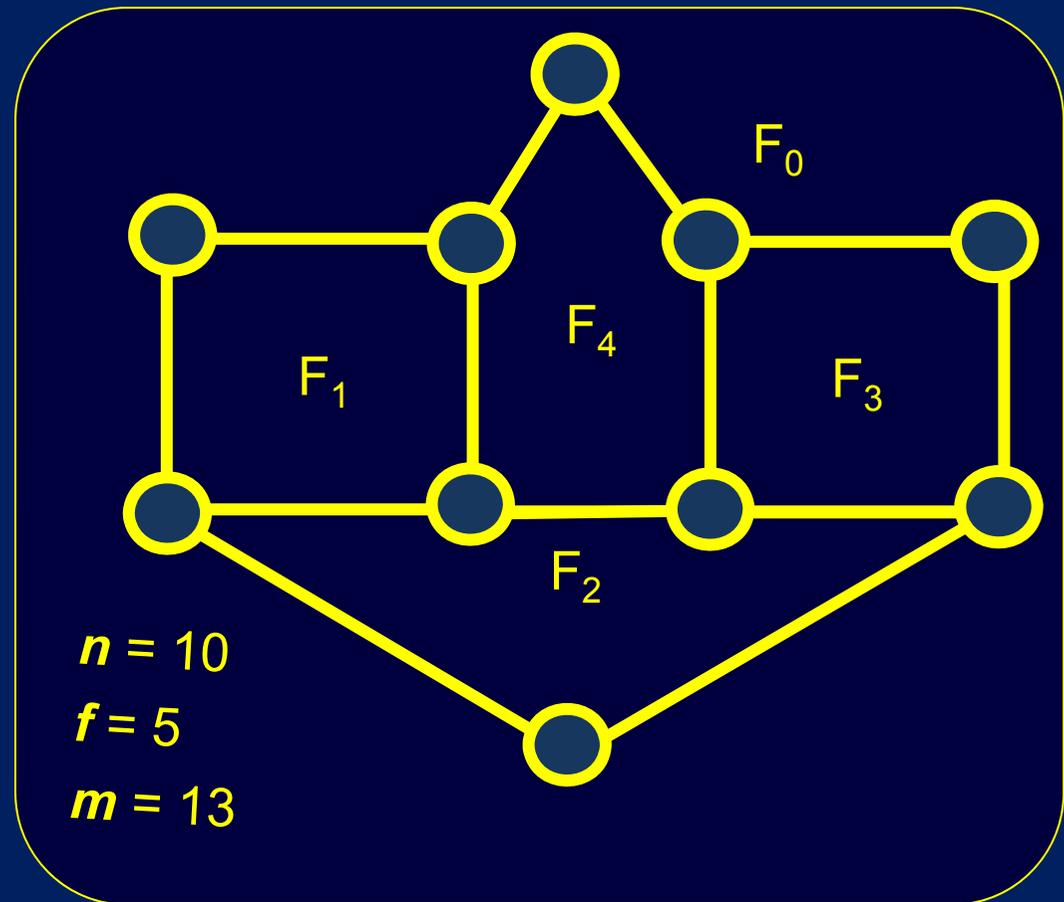
then

$$n + f = m + 2$$

Corollary  $m \leq 3n - 6$

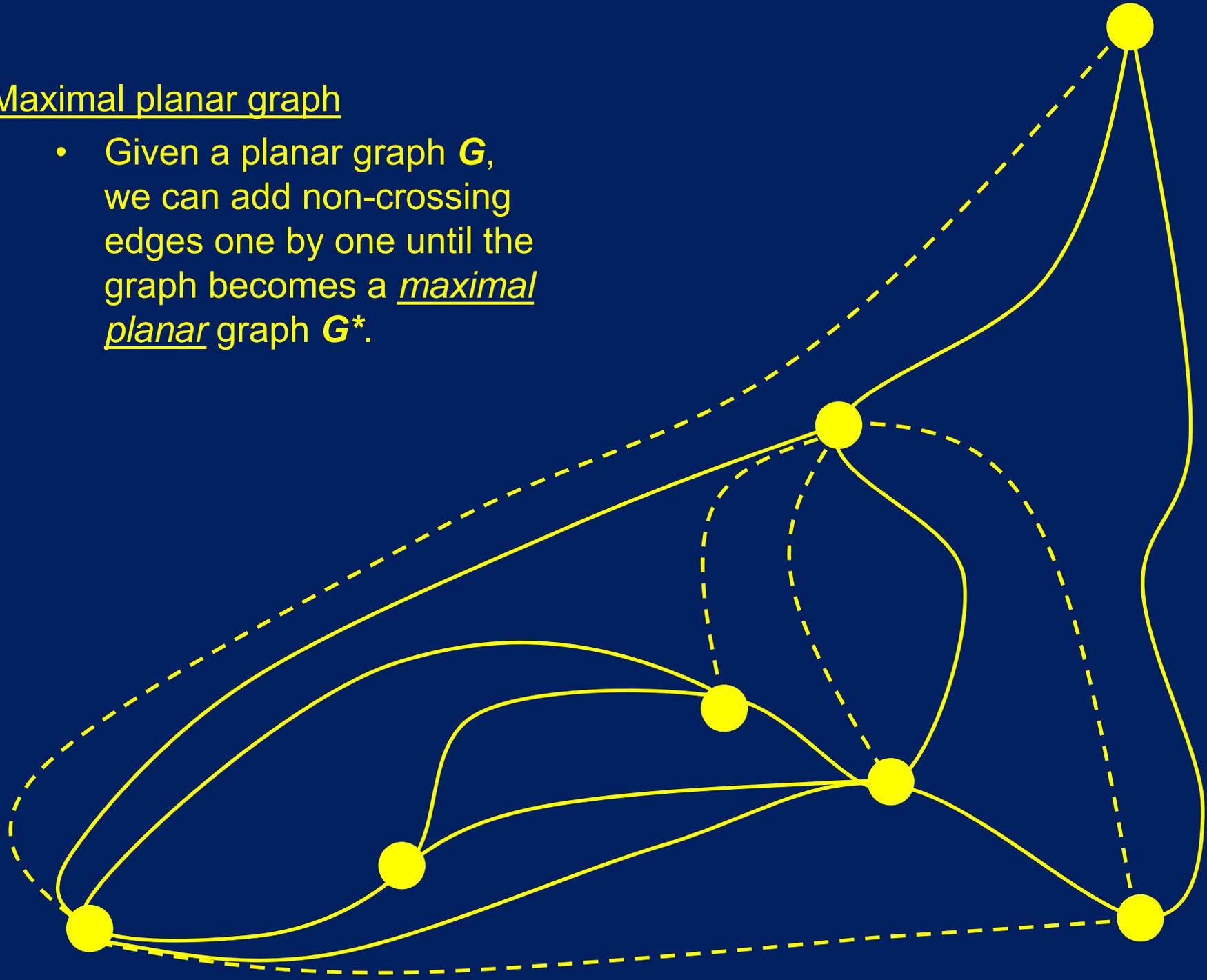
Corollary

If  $m = 3n - 6$  then every face is a triangle



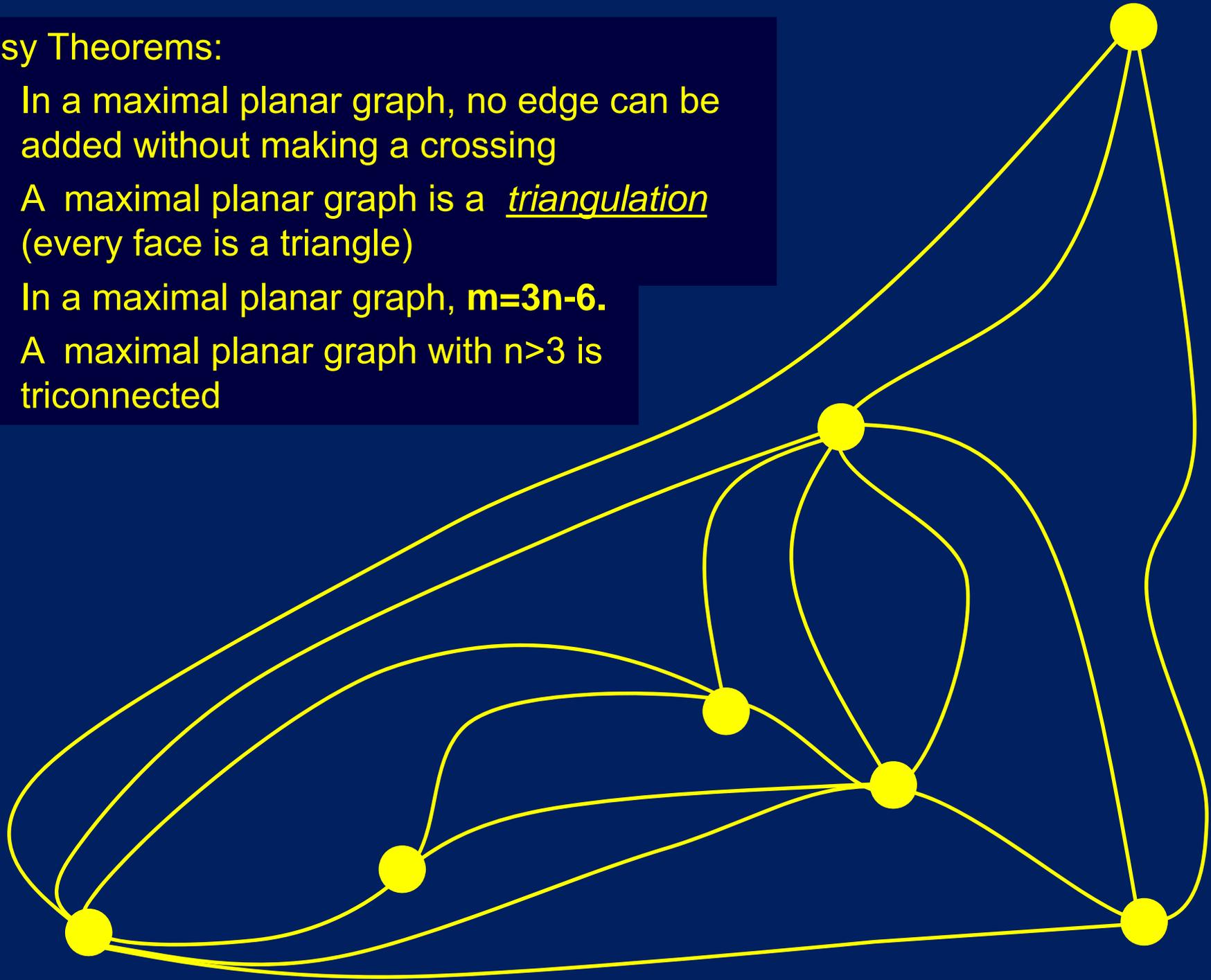
## Maximal planar graph

- Given a planar graph  $G$ , we can add non-crossing edges one by one until the graph becomes a maximal planar graph  $G^*$ .



## Easy Theorems:

- In a maximal planar graph, no edge can be added without making a crossing
- A maximal planar graph is a triangulation (every face is a triangle)
- In a maximal planar graph,  $m=3n-6$ .
- A maximal planar graph with  $n>3$  is triconnected



(e) Good graph drawing

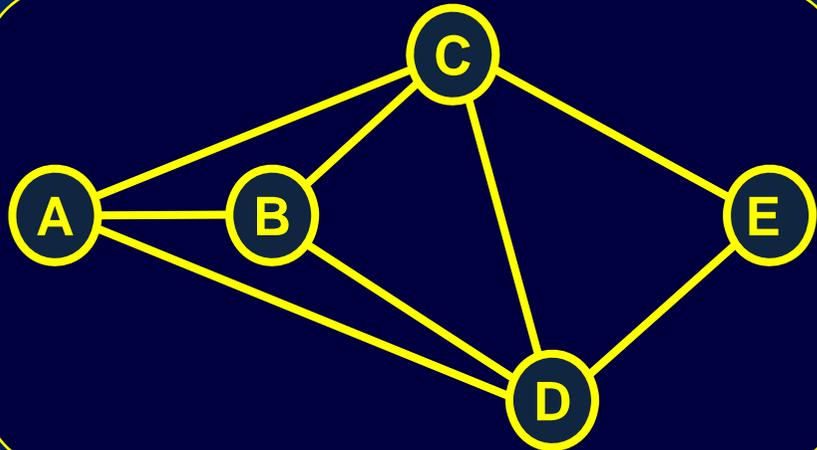
Graph

```
A - B, C, D
B - A, C, D
C - A, B, D, E
D - A, B, C, E
E - C, D
```

*The input is a graph  
with no geometry*



Graph Drawing



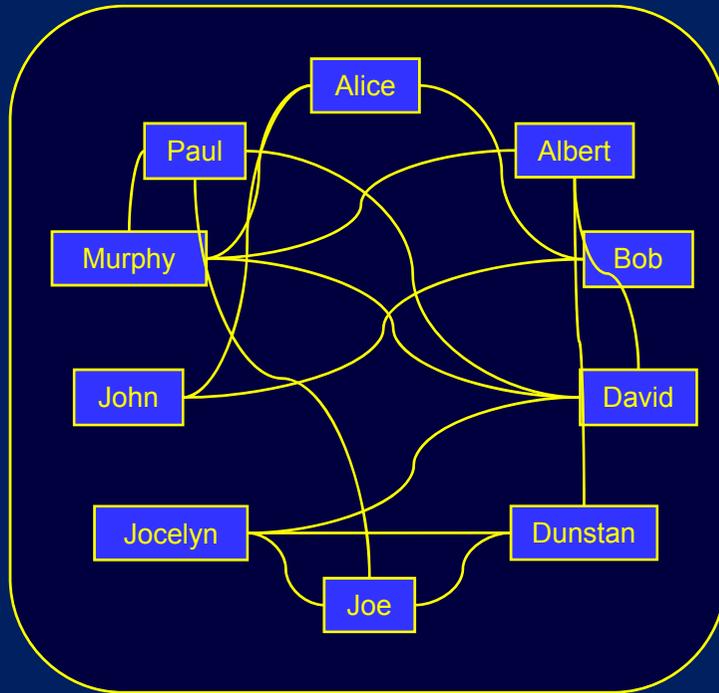
*The output should be a  
good graph drawing:*

- easy to understand,
- easy to remember,
- beautiful.

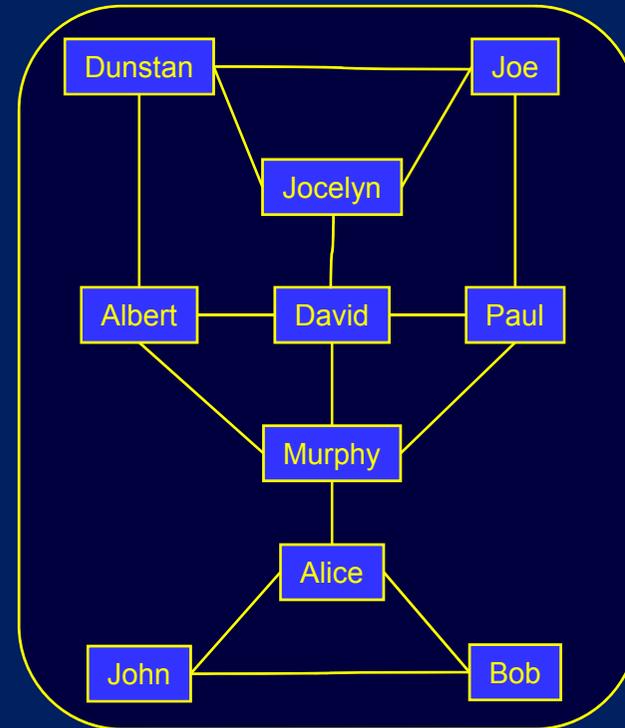
~1979 Intuition (Sugiyama et al. 1979; Batini et al 1982; etc ):

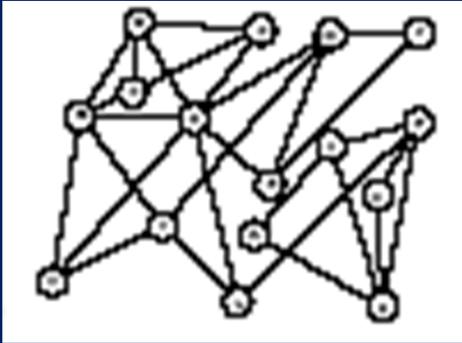
- Planar straight-line drawings make good pictures

Bad drawing



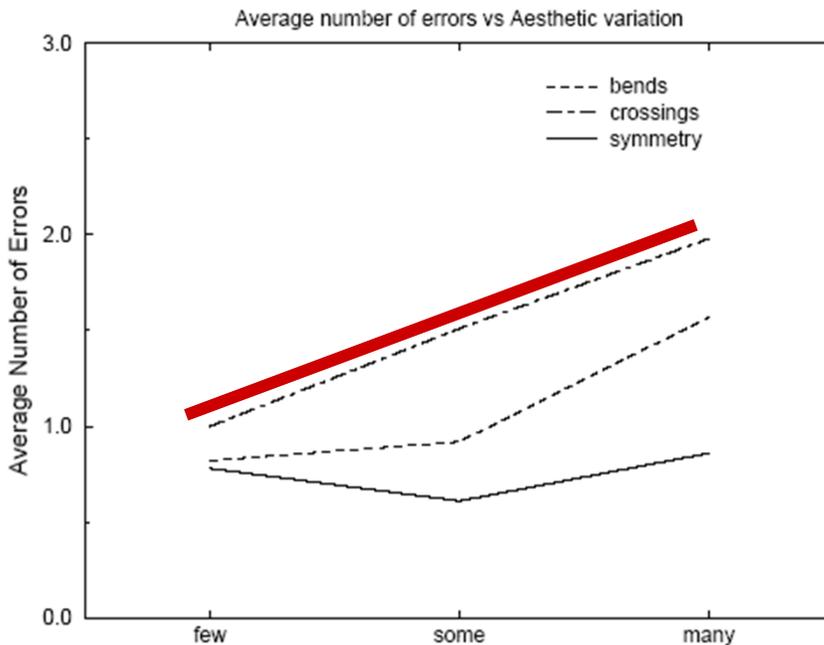
Good drawing





Purchase et al., 1997:  
 Significant correlation between edge crossings and human understanding

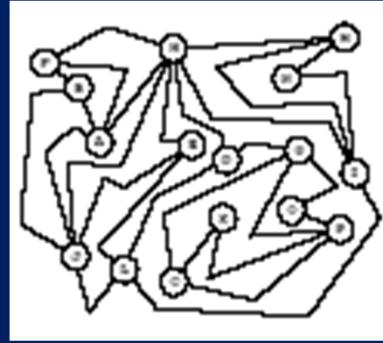
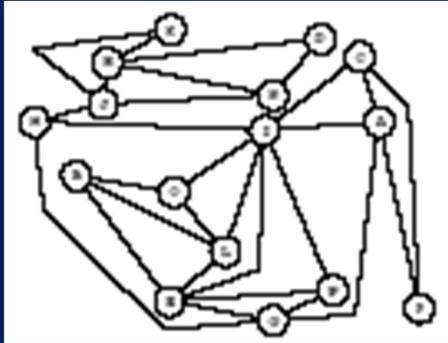
➤ *More edge crossings means more human errors in understanding*



bends	6	18	30
crossings	6	24	42
symmetry	4.6	25.7	51

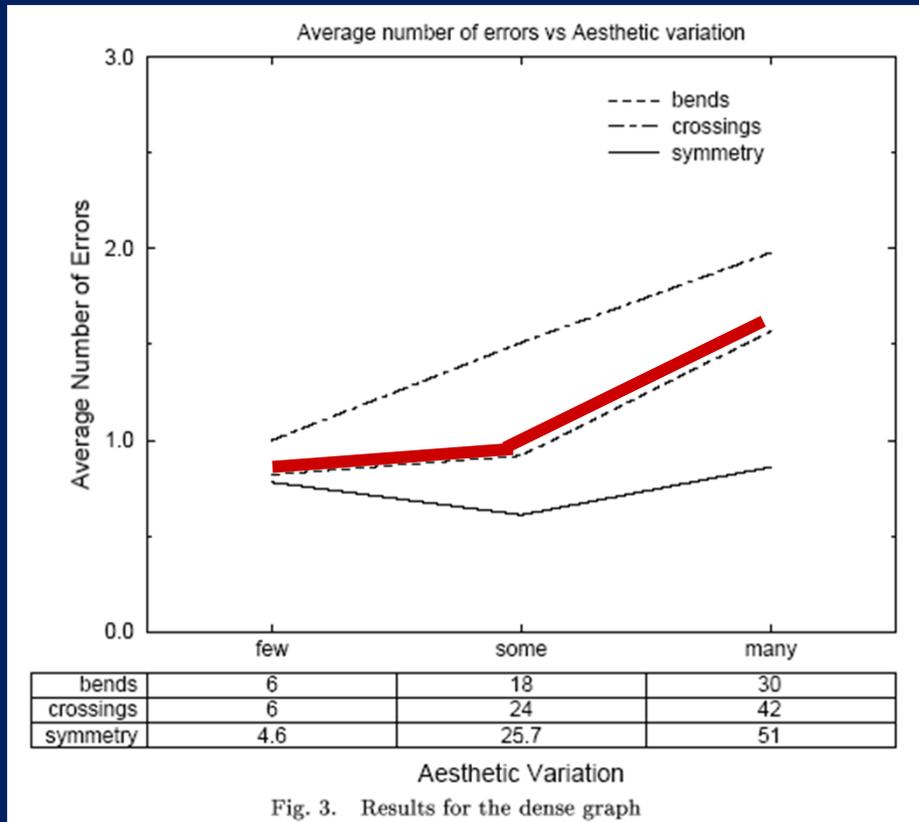
Aesthetic Variation

Fig. 3. Results for the dense graph



Purchase et al., 1997:  
 Significant correlation between straightness of edges and human understanding

➤ *More bends mean more human errors in understanding*



What makes a good drawing of a graph?

- lack of edge crossings (planar drawings are good!)
- straightness of edges (straight-line drawings are good!)

(plus some other things)

## 2. How to draw a graph

a) Before Tutte: 1920s – 1950s

*Fáry's Theorem*

Every topological embedding of a planar graph has a straight-line planar drawing.

Proved independently by Wagner (1936),  
Fary (1948) and Stein (1951)

Graph

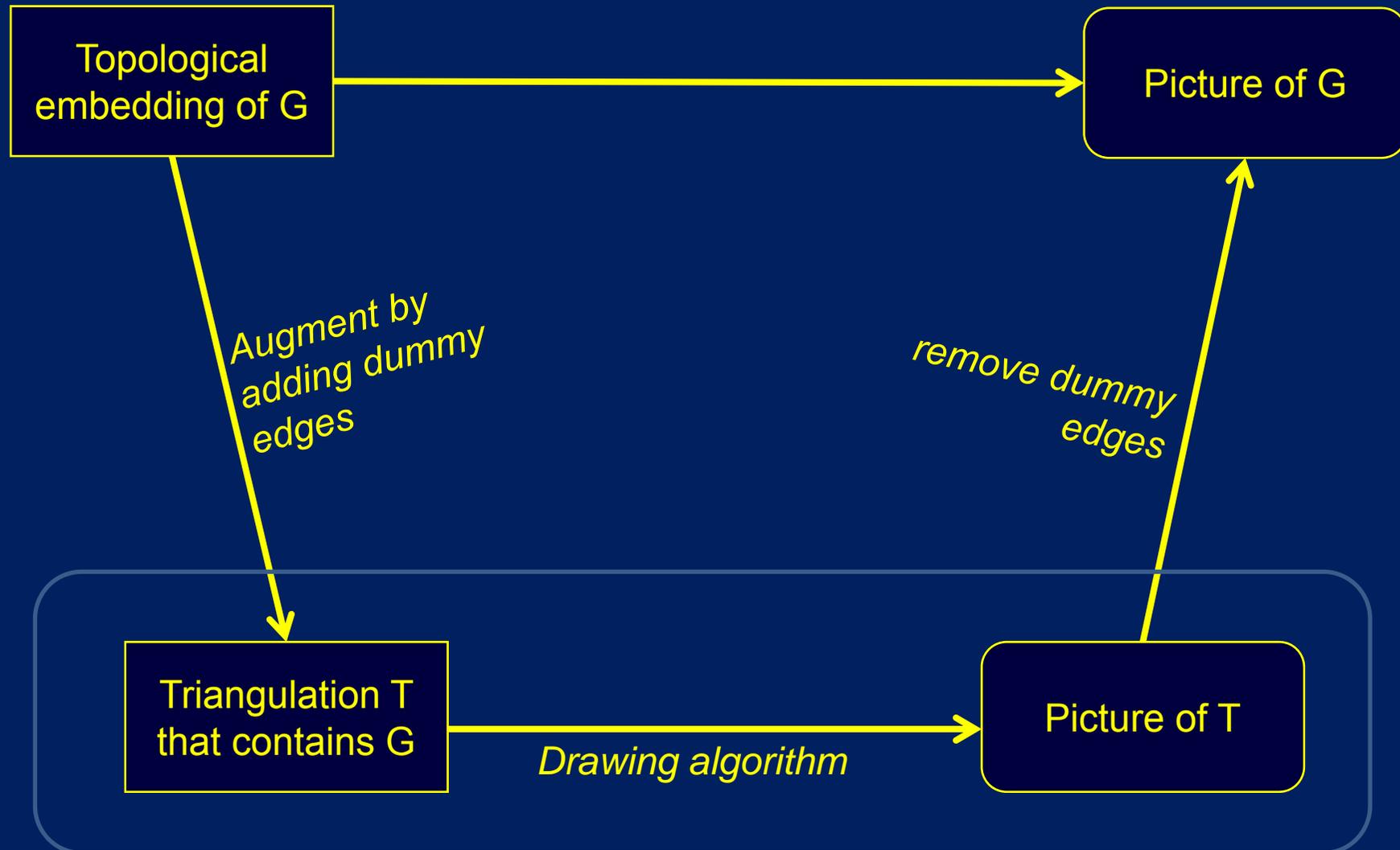
Topological  
embedding

Graph  
Drawing

*Fáry's Theorem*

## Wikipedia proof of Fáry's Theorem:

- First note that it is enough to prove it for triangulations.



We prove Fáry's theorem by induction on the number of vertices.

If  $G$  has only three vertices, then it is easy.

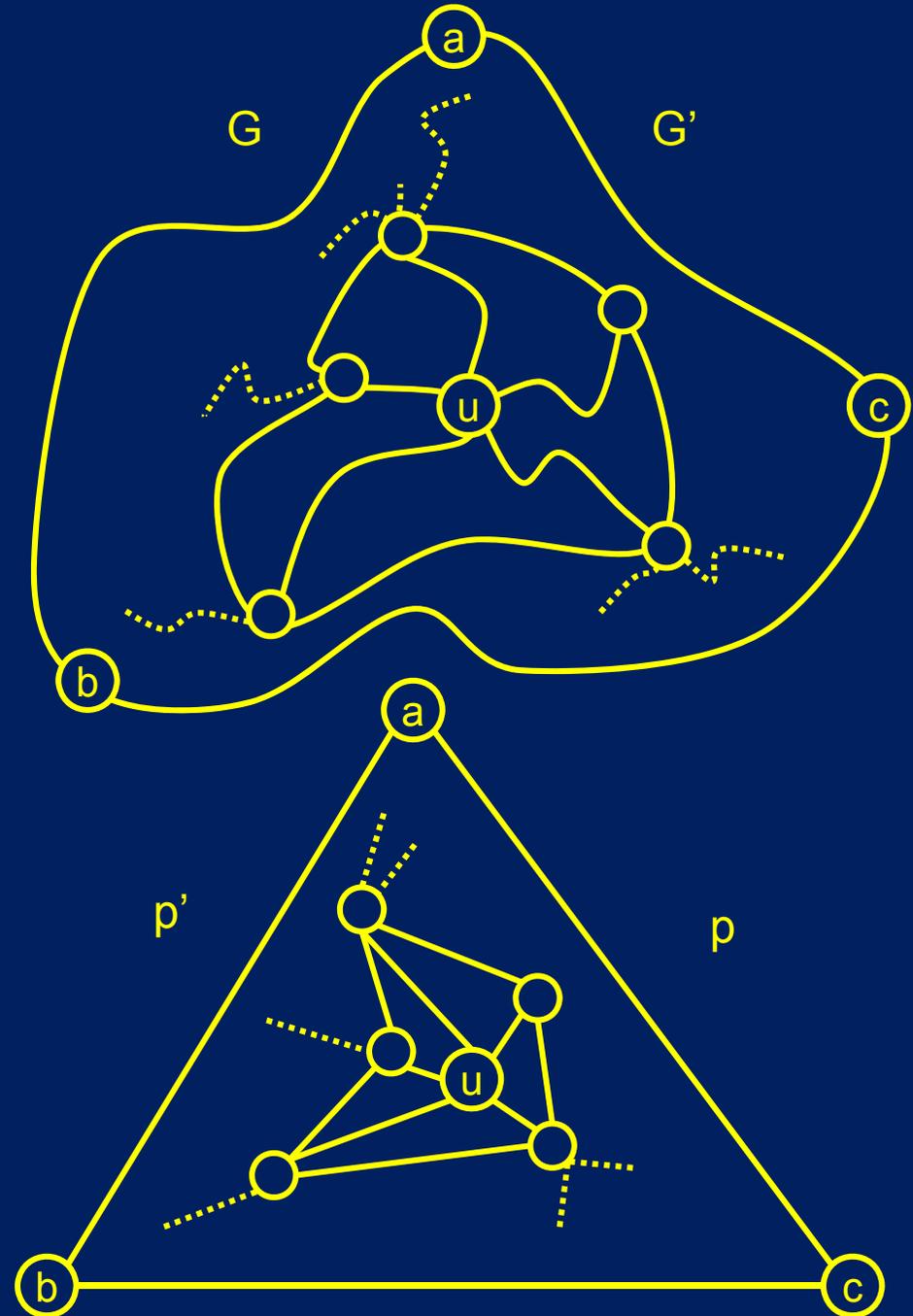
Suppose  $G$  has  $n > 3$  vertices and  $3n - 6$  edges, and that the outer face of  $G$  is the triangle  $\langle abc \rangle$ .

Since every vertex has degree at least 3, Euler implies that there is a vertex  $u$  not on the outside face with degree at most 5.

Delete  $u$  from  $G$  to form  $G'$ ; this gives a face  $F$  of  $G$  of size at most 5.

Since  $G'$  has  $n - 1$  vertices, by induction it has a planar straight-line drawing  $p'$ .

Since  $F$  has at most 5 vertices, it is star-shaped, and we can place the vertex  $u$  in the kernel of  $F$  to give a planar straight-line drawing  $p$  of  $G$ .



## 2. How to draw a graph?

a) Before Tutte: 1920s – 1950s

b) Tutte

W. T. Tutte,

“How to Draw a Graph”,

*Proceedings of the London Mathematical Society*

13, pp743 – 767, 1960

## Tutte's barycentre algorithm

Input:

- A graph  $G = (V, E)$

Output

- A straight-line drawing  $p$

Step 1. Choose a subset  $A$  of  $V$

Step 2. Choose a location  $p(a) = (x_a, y_a)$  for each vertex  $a \in A$

Step 3. For all  $u \in V - A$ , choose  $p(u)$  by

$$p(u) = \frac{1}{\deg(u)} \sum_{v \in N(u)} p(v)$$

where the sum is over all neighbors  $v$  of  $u$

Vertex  $u$  is placed at the "barycenter" of its neighbors

Step 1. Choose a subset  $A$  of  $V$

Step 2. Choose a location  $p(a) = (x_a, y_a)$  for each vertex  $a \in A$

Step 3. For all  $u \in V-A$ ,

$$p(u) = \frac{1}{\deg(u)} \sum_{v \in N(u)} p(v)$$

where the sum is over all neighbors  $v$  of  $u$

$$x(u) = \frac{1}{\deg(u)} \sum_{v \in N(u)} x(v)$$

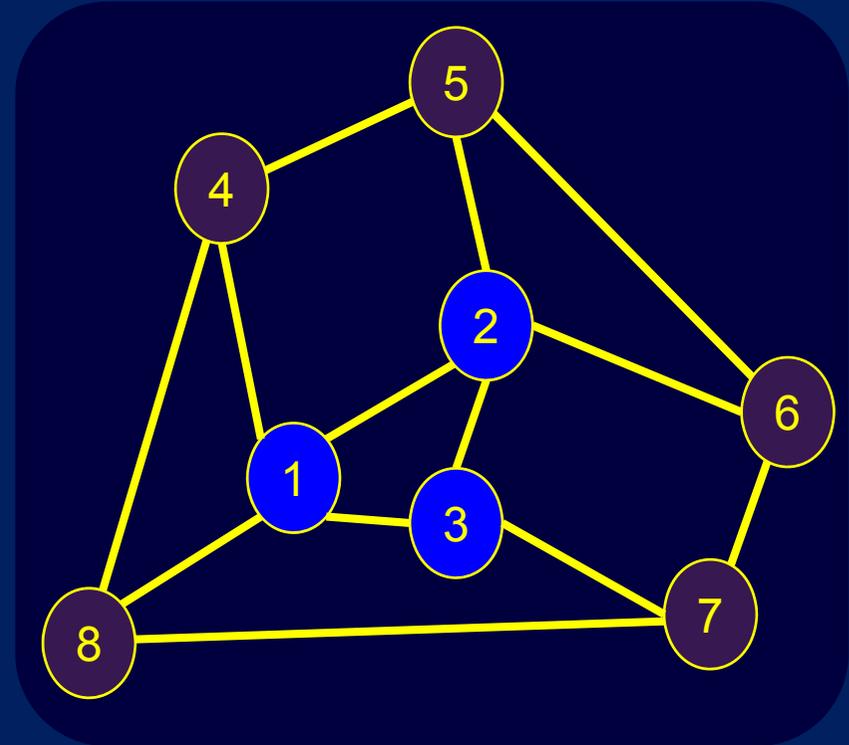
and

$$y(u) = \frac{1}{\deg(u)} \sum_{v \in N(u)} y(v)$$

equations  
2n

## Tutte's barycenter algorithm

1. Choose a set  $A$  of vertices.
2. Choose a location  $p(a)$  for each  $a \in A$
3. For each vertex  $u \in V - A$ , place  $u$  at the barycentre of its graph-theoretic neighbors.



## Example

Step 1.  $A = \{4, 5, 6, 7, 8\}$

Step 2. For all  $i = 4, 5, 6, 7, 8$ ,  
choose  $x_i$  and  $y_i$  in some way.

Step 3. Find  $x_1, y_1, x_2, y_2, x_3$ , and  $y_3$   
such that:

$$x_1 = \frac{1}{4}(x_2 + x_3 + x'_4 + x'_8)$$

$$x_2 = \frac{1}{4}(x_1 + x_3 + x'_5 + x'_6)$$

$$x_3 = \frac{1}{3}(x_1 + x_2 + x'_7)$$

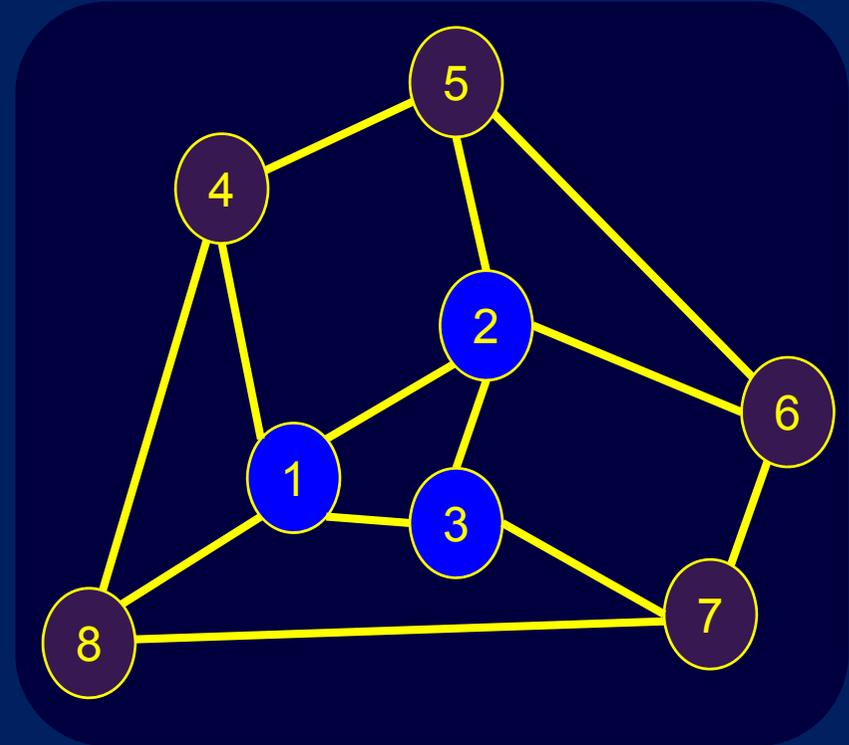
and

$$y_1 = \frac{1}{4}(y_2 + y_3 + y'_4 + y'_8)$$

$$y_2 = \frac{1}{4}(y_1 + y_3 + y'_5 + y'_6)$$

$$y_3 = \frac{1}{3}(y_1 + y_2 + y'_7)$$

where  $x'_i$  and  $y'_i$  are the values  
chosen at step 2.



Step 1.  $A = \{4, 5, 6, 7, 8\}$

Step 2. For all  $i = 4, 5, 6, 7, 8$ , choose  $x_i$  and  $y_i$  in some way.

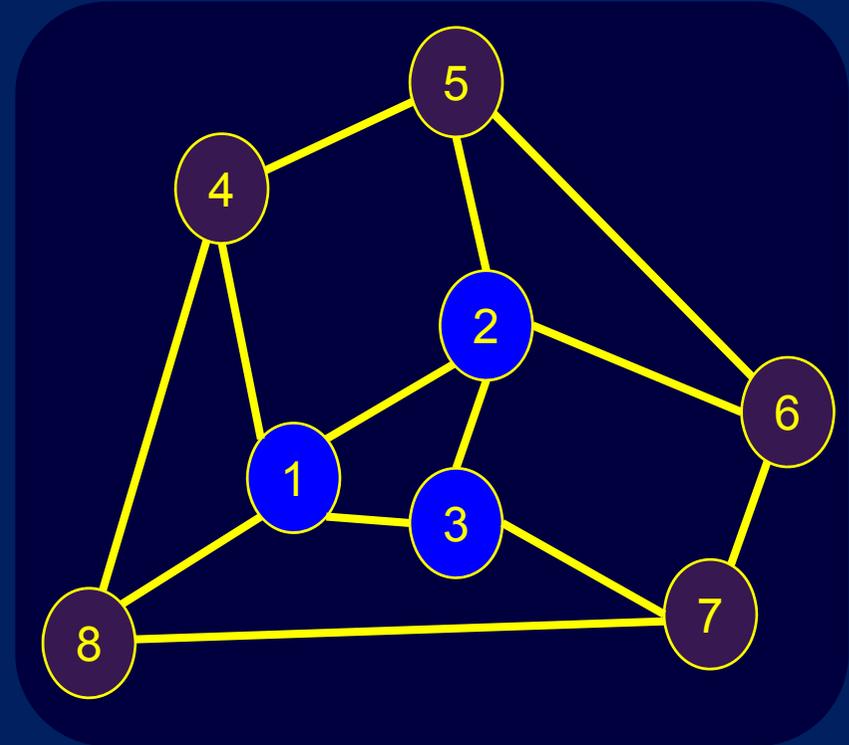
Step 3. Find  $x_1, y_1, x_2, y_2, x_3$ , and  $y_3$  such that:

$$\begin{aligned}4x_1 - x_2 - x_3 &= x'_4 + x'_8 = c_1 \\ -x_1 + 4x_2 - x_3 &= x'_5 + x'_6 = c_2 \\ -x_1 - x_2 + 3x_3 &= x'_5 = c_3\end{aligned}$$

and

$$\begin{aligned}4y_1 - y_2 - y_3 &= y'_4 + y'_8 = d_1 \\ -y_1 + 4y_2 - y_3 &= y'_5 + y'_6 = d_2 \\ -y_1 - y_2 + 3y_3 &= y'_5 = d_3\end{aligned}$$

where  $c_1, c_2, c_3, d_1, d_2, d_3$  are constants



Step 1.  $A = \{4, 5, 6, 7, 8\}$

Step 2. For all  $i = 4, 5, 6, 7, 8$ , choose  $x_i$  and  $y_i$  in some way.

Step 3. Find vectors  $x = \begin{bmatrix} x_1 \\ x_2 \\ x_3 \end{bmatrix}$  and  $y = \begin{bmatrix} y_1 \\ y_2 \\ y_3 \end{bmatrix}$

such that

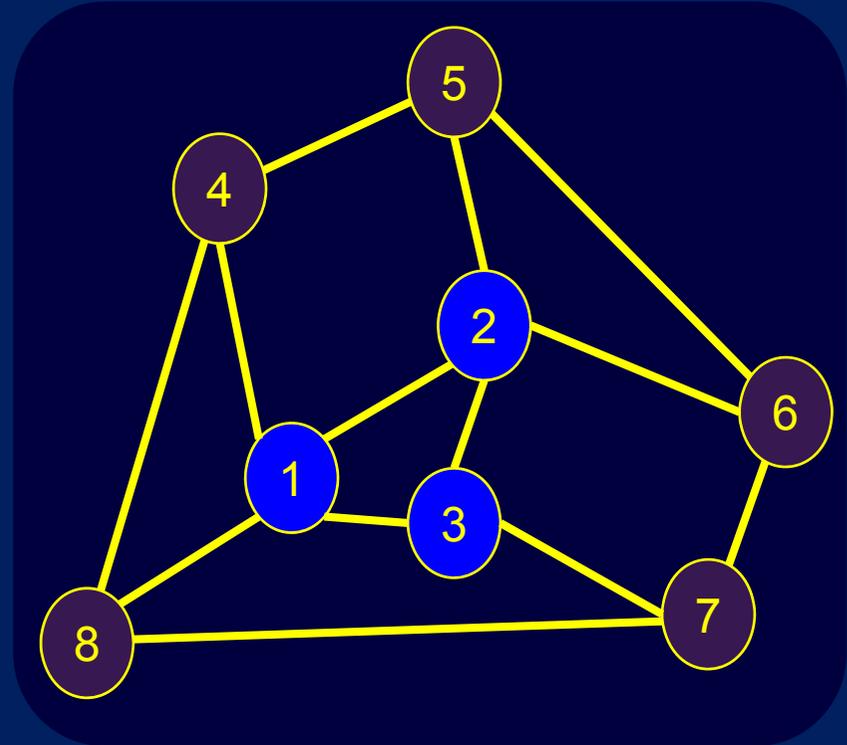
$$Mx = c$$

and

$$My = d$$

where

$$M = \begin{bmatrix} 4 & -1 & -1 \\ -1 & 4 & -1 \\ -1 & -1 & 3 \end{bmatrix}$$



The essence of Tutte's barycentre algorithm is inverting a matrix

## Tutte's barycentre algorithm

Input: A graph  $G = (V, E)$

Output: A straight-line drawing  $p$

Step 1. Choose a subset  $A$  of  $V$

Step 2. Choose a location  $p(a) = (x_a, y_a)$  for each vertex  $a \in A$

Step 3. Let  $M$  be the matrix, indexed by  $V-A$ , defined by

$$M_{uv} = \begin{cases} \deg(u) & \text{if } u = v \\ -1 & \text{if } (u, v) \in E \\ 0 & \text{otherwise} \end{cases}$$

- This is a special matrix: *Laplacian submatrix*.
- Many software packages can invert such a matrix efficiently

Let  $c$  and  $d$  be the vectors, indexed by  $V-A$ , defined by

$$c_u = \sum_{w \in A} x_w, \quad \text{and} \quad d_u = \sum_{w \in A} y_w.$$

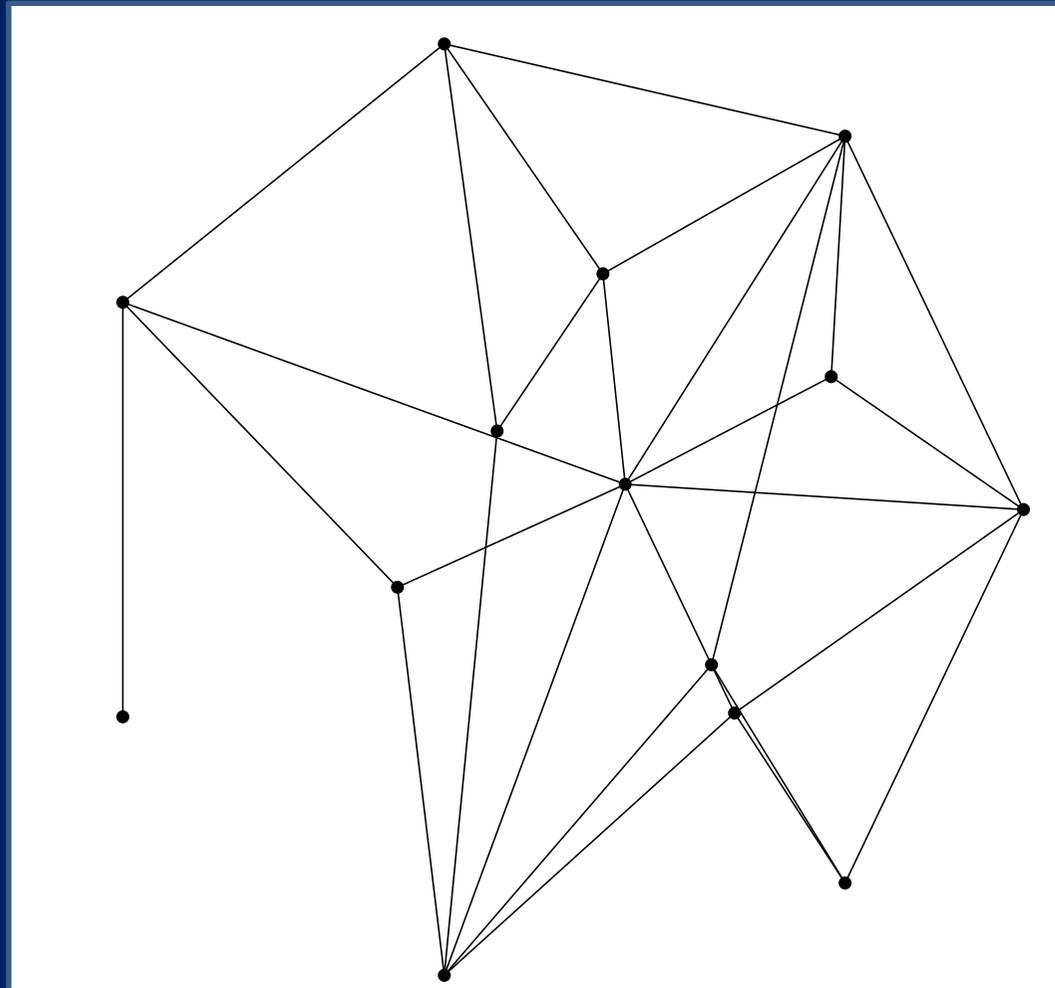
Then choose  $x$  and  $y$  to be the vectors, indexed over  $V-A$ , defined by

$$x = M^{-1}c \quad \text{and} \quad y = M^{-1}d.$$

Then choose  $p(u) = (x_u, y_u)$  for all  $u \in V - A$ .

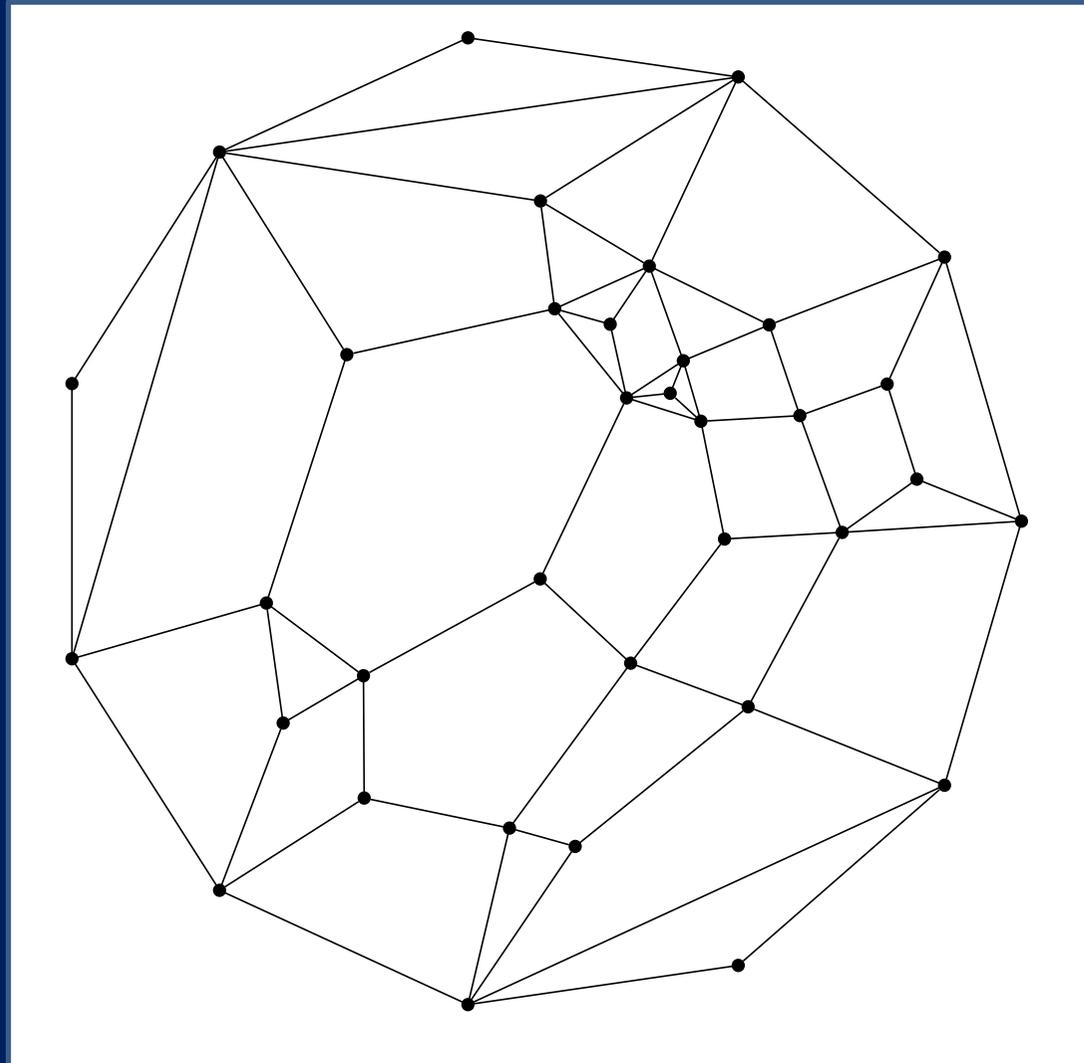
## Tutte's barycentre algorithm

- Example output on a non-planar graph



## Tutte's barycentre algorithm

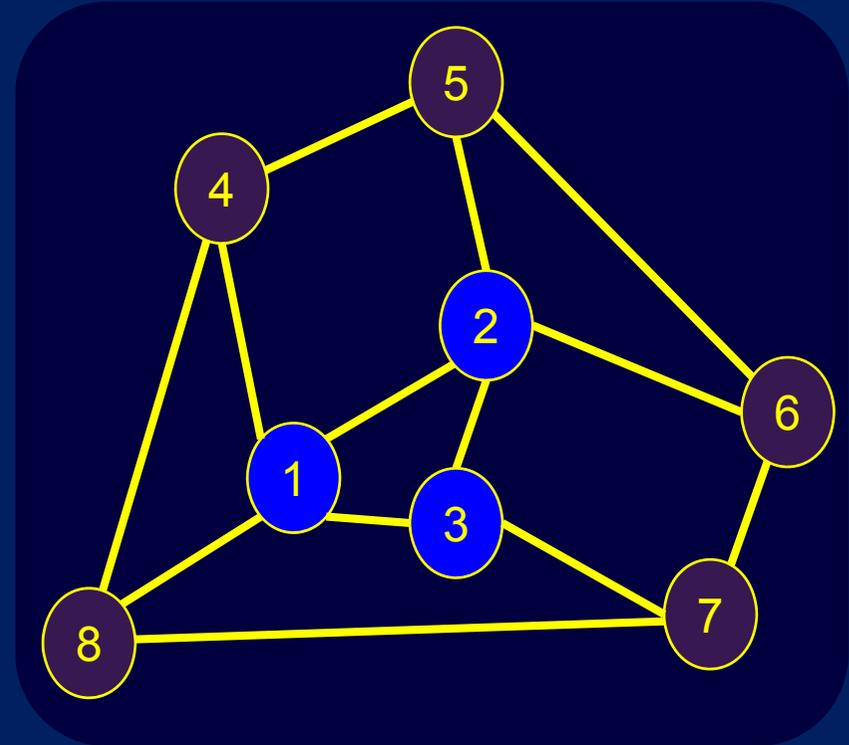
- Example output on a planar graph



Tutte's barycenter algorithm for  
*triconnected planar graphs* .....

## Tutte's barycenter algorithm for triconnected planar graphs

1. Choose  $A$  to be the outside face of the topological embedding.
2. Choose the location  $p(a)$  for each  $a \in A$  to be at the vertices of a convex polygon.
3. For each vertex  $u \in V - A$ , place  $u$  at the barycentre of its graph-theoretic neighbors.



*Note: For planar graphs, the Laplacian matrix is sparse, and can be inverted fast.*

## Tutte's amazing theorem (1960)

If the input graph is planar and triconnected, then

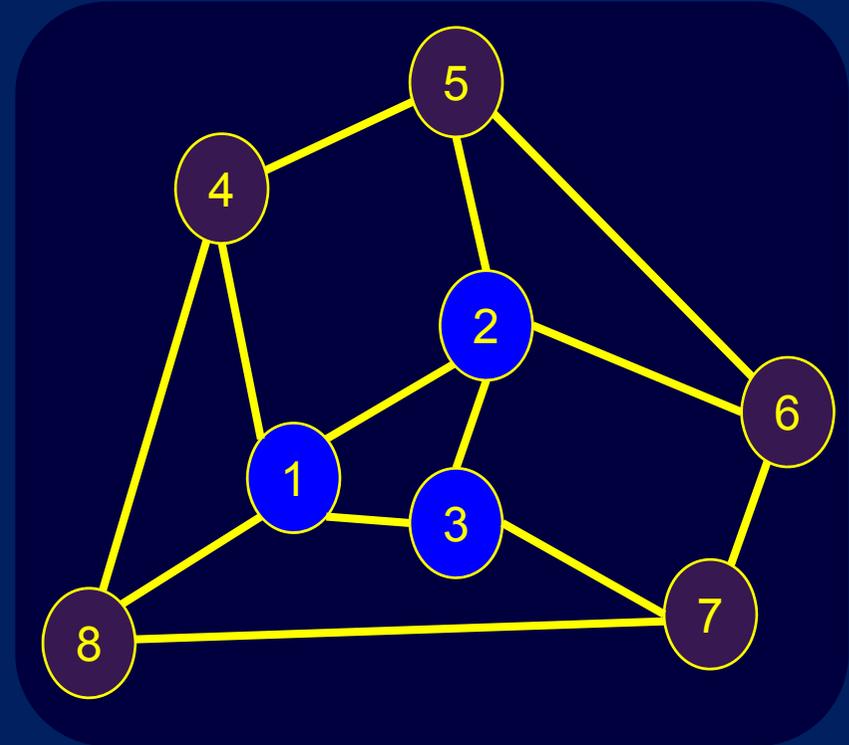
- the drawing output by the barycentre algorithm is planar, and
- every face is convex.

The energy view of Tutte's barycentre algorithm

Tutte's barycenter algorithm:

The energy view

1. Choose a set A of vertices.
2. Choose a location p(a) for each a∈A
3. Place all the other vertices to minimize energy.



What is the *energy* of a drawing p?

- The Euclidean distance between u and v in the drawing p is:  
$$d(u, v) = \sqrt{(x_u - x_v)^2 + (y_u - y_v)^2}$$
- The energy in the edge (u,v) is  $d(u, v)^2 = (x_u - x_v)^2 + (y_u - y_v)^2$
- The energy in the drawing p is the sum of the energy in its edges, ie,

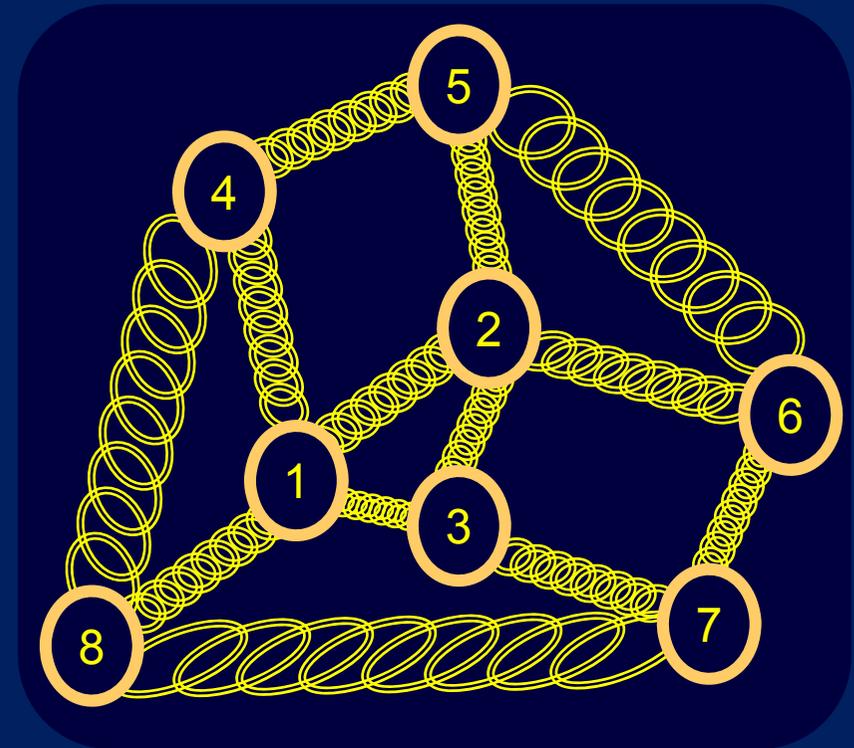
$$energy(p) = \sum_{(u,v) \in E} d(u, v)^2 = \sum_{(u,v) \in E} (x_u - x_v)^2 + (y_u - y_v)^2$$

Tutte's barycenter algorithm:

*The energy view*

We represent each vertex by a steel ring, and represent each edge by a spring of natural length zero connecting the rings at its endpoints.

1. Choose a set  $A$  of vertices.
2. For each  $a \in A$ , nail the ring representing  $a$  to the floor at some position.
3. The vertices in  $V-A$  will move around a bit; when the movement stops, take a photo of the layout; this is the drawing.



How to minimize energy:

- Choose a location  $p(u) = (x_u, y_u)$  for each  $u \in V - A$  to minimize

$$\text{energy}(p) = \sum_{(u,v) \in E} d(u,v)^2 = \sum_{(u,v) \in E} (x_u - x_v)^2 + (y_u - y_v)^2$$

- Note that the minimum is unique, and occurs when

$$\frac{\partial (\text{energy}(p))}{\partial x_u} = 0 \quad \text{and} \quad \frac{\partial (\text{energy}(p))}{\partial y_u} = 0$$

for each  $u \in V - A$ .

For  $x_u$ , the minimum occurs when:

$$\frac{\partial (\text{energy}(p))}{\partial x_u} = 0$$

$$\frac{\partial}{\partial x_u} \left( \sum_{(u,v) \in E} (x_u - x_v)^2 + (y_u - y_v)^2 \right) = 0$$

$$\sum_{v \in V \text{ s.t. } (u,v) \in E} 2(x_u - x_v) = 0$$

Barycentre  
equations

$$x_u = \frac{1}{\text{deg}(u)} \sum_{v \in V \text{ s.t. } (u,v) \in E} x_v$$

How good is Tutte's barycentre algorithm?

***Efficiency:***

- In theory it is not bad:  $O(n^{1.5})$  for planar graphs
- In practice it is fast, using numerical methods

***Elegance:***

- Very simple algorithm
- Easy to implement
- Numerical software available for the hard parts

***Effectiveness:***

- Planar graphs drawn planar
- Convex faces
- Straight-line edges



***But unfortunately →***

But unfortunately:

➤ Tutte's algorithm gives poor vertex resolution in many cases

Example:

- Vertex a is at (0.5, 0)
- b is at (0,0)
- c is at (1,0).
- Suppose that vertex j is at  $(x_j, y_j)$  for  $0 < j < n$ .

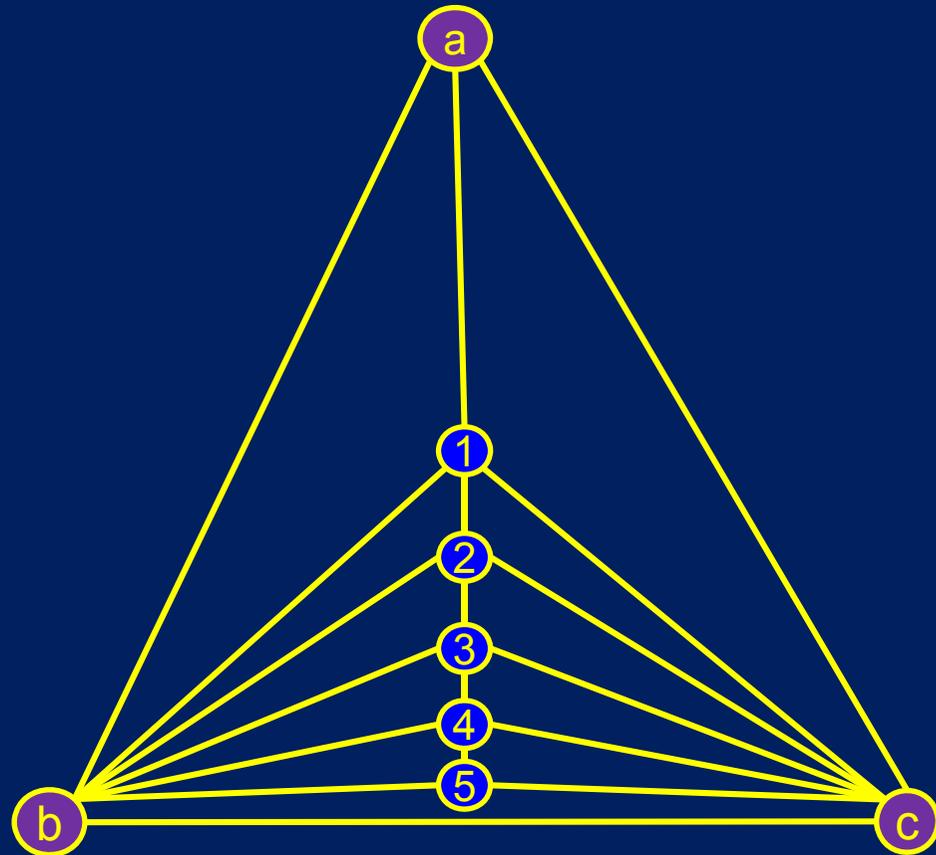
From the barycentre equations:

$$\begin{cases} x_j = 0.5 \\ y_j = \frac{1}{4}(y_{j-1} + y_{j+1}) \end{cases}$$

One can deduce that

$$|y_{j-1} - y_j| < \frac{1}{2^j}$$

That is, some vertices are exponentially close together.



Aside:

- Commercial graph drawing software needs good resolution.

How good is Tutte's barycentre algorithm?

***Efficiency:***

➤ OK

***Elegance:***

➤ Excellent

***Effectiveness:***

➤ So-so

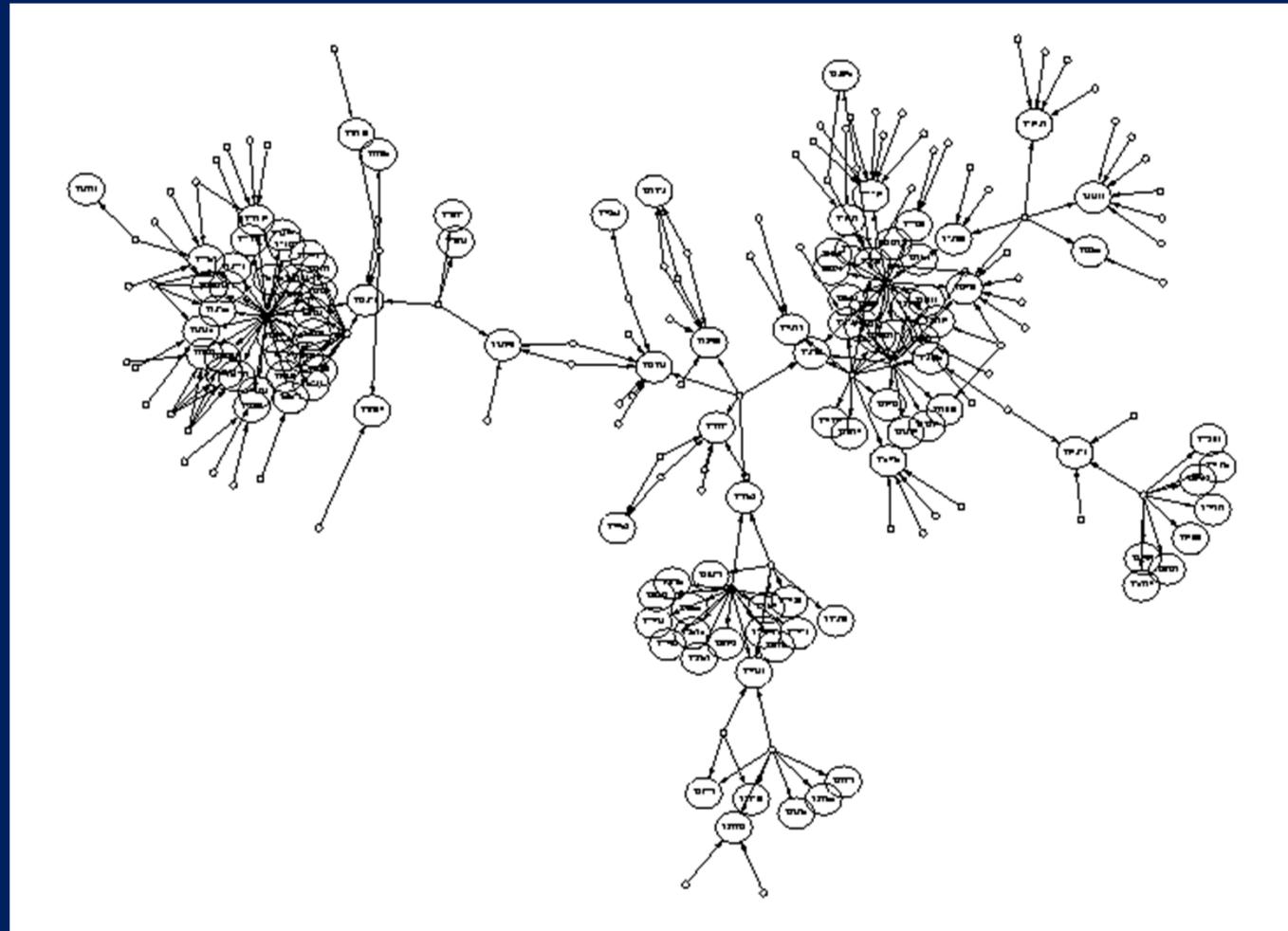
## 2. How to draw a planar graph?

- a) Before Tutte: 1920s – 1950s
- b) Tutte: 1960s
- c) After Tutte: 1970s – 1990s

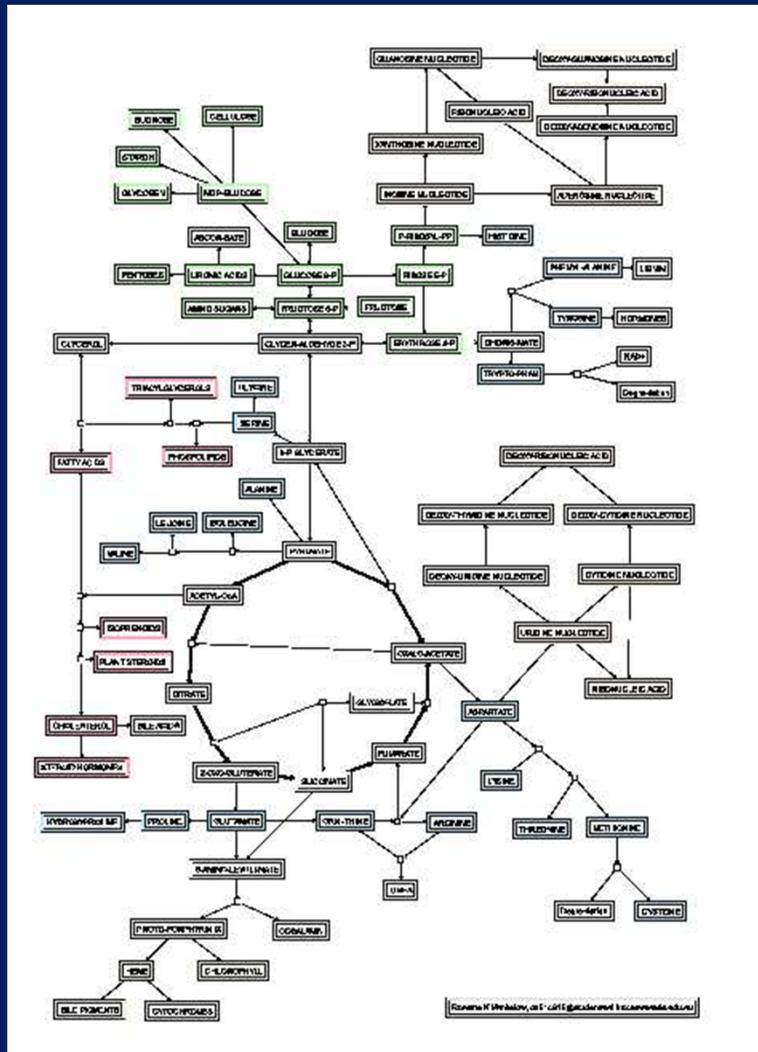
## After Tutte: 1970s – 1990s

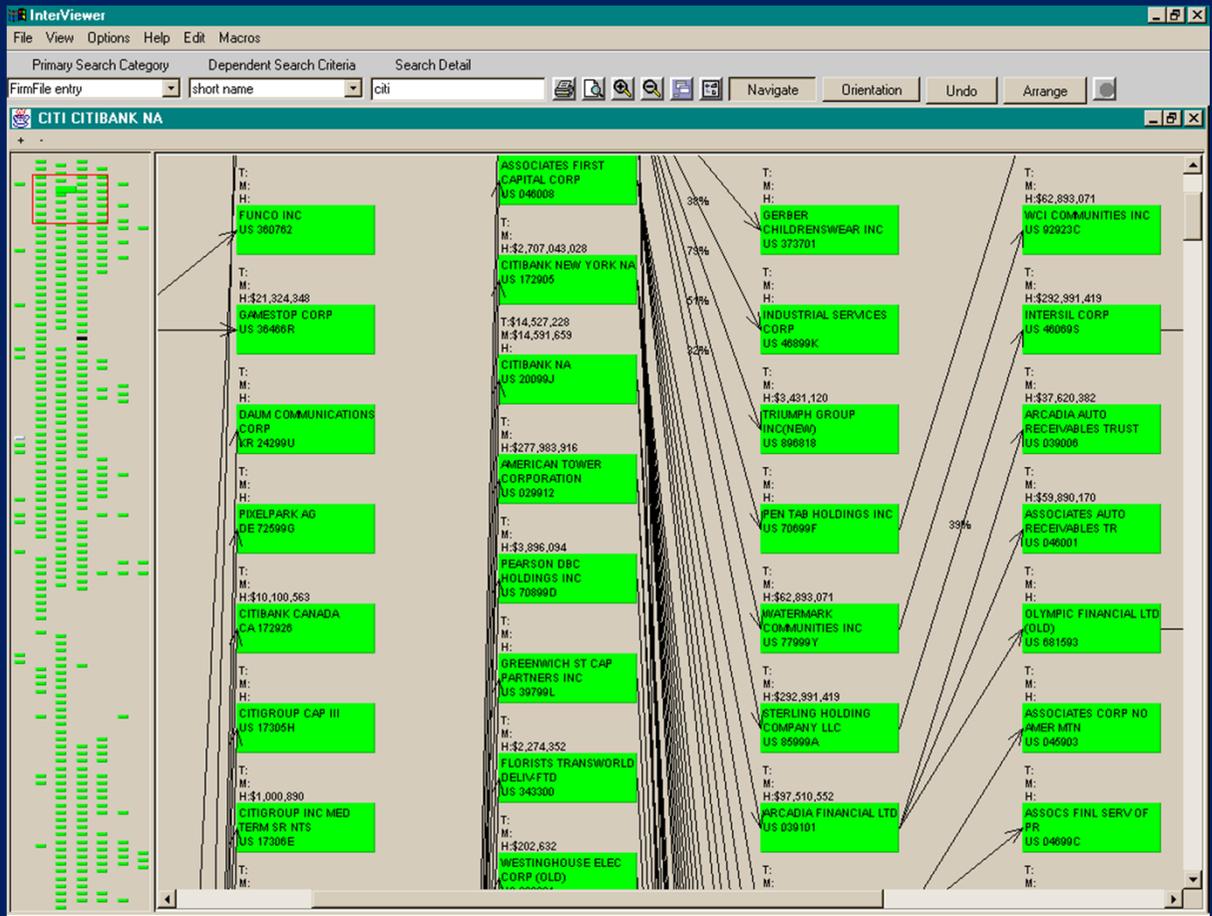
Sometime in the 1980s, the motivation for graph drawing changed from Mathematical curiosity to visual data mining.

# Software



# Biology





Risk Exposure

From the 1980s, industrial demand for graph drawing algorithms has grown

- Software engineering: CASE systems, reverse engineering
- Biology: PPI networks, gene regulatory networks
- Physical networks: network management tools
- Security: risk management, money movements
- Social network analysis
- Customer relationship management: value identification

Many companies buy graph drawing algorithms, many code them.

Currently the international market for graph drawing algorithms is in the hundreds of millions of dollars per year.

Tutte's barycentre  
algorithm

```
graph TD; A[Tutte's barycentre algorithm] --> B[Planarity-based methods]; A --> C[Force directed methods]; B --> D[Planarity based methods after Tutte];
```

Planarity-based  
methods

Force directed  
methods

*Planarity based  
methods after  
Tutte*

## Planarity based methods after Tutte

### R.C. Read (1979, 1980)

1. Efficient?
  - Yes, linear time algorithm
  
2. Elegant?
  - Yes: follows proof of Fáry's theorem, with some tricks to make it into an efficient algorithm
  
3. Effective?
  - Maybe ...
    - Straight-line planar drawings of planar graphs
  
    - But unfortunately, output has poor vertex resolution

## Planarity based methods after Tutte

### Chiba-Nishizeki-Yamanouchi (1984)

1. Efficient?
  - Yes, linear time algorithm
  
2. Elegant?
  - Yes, a simple divide&conquer approach
  
3. Effective?
  - Maybe ...
    - Straight-line planar drawings of planar graphs
    - Convex faces for well connected input
  
    - But unfortunately, output has poor vertex resolution

## Planarity based methods after Tutte

### Breakthrough in 1989:

#### de Fraysseix-Pach-Pollack Theorem (1989)

Every planar graph has a planar straight-line drawing with vertices located on a  $2n \times 4n$  integer grid.

#### Notes:

- Good resolution: the minimum distance between vertices is at least  $\text{screen size}/4n$ .
- Linear time (Chrobak, 1990)

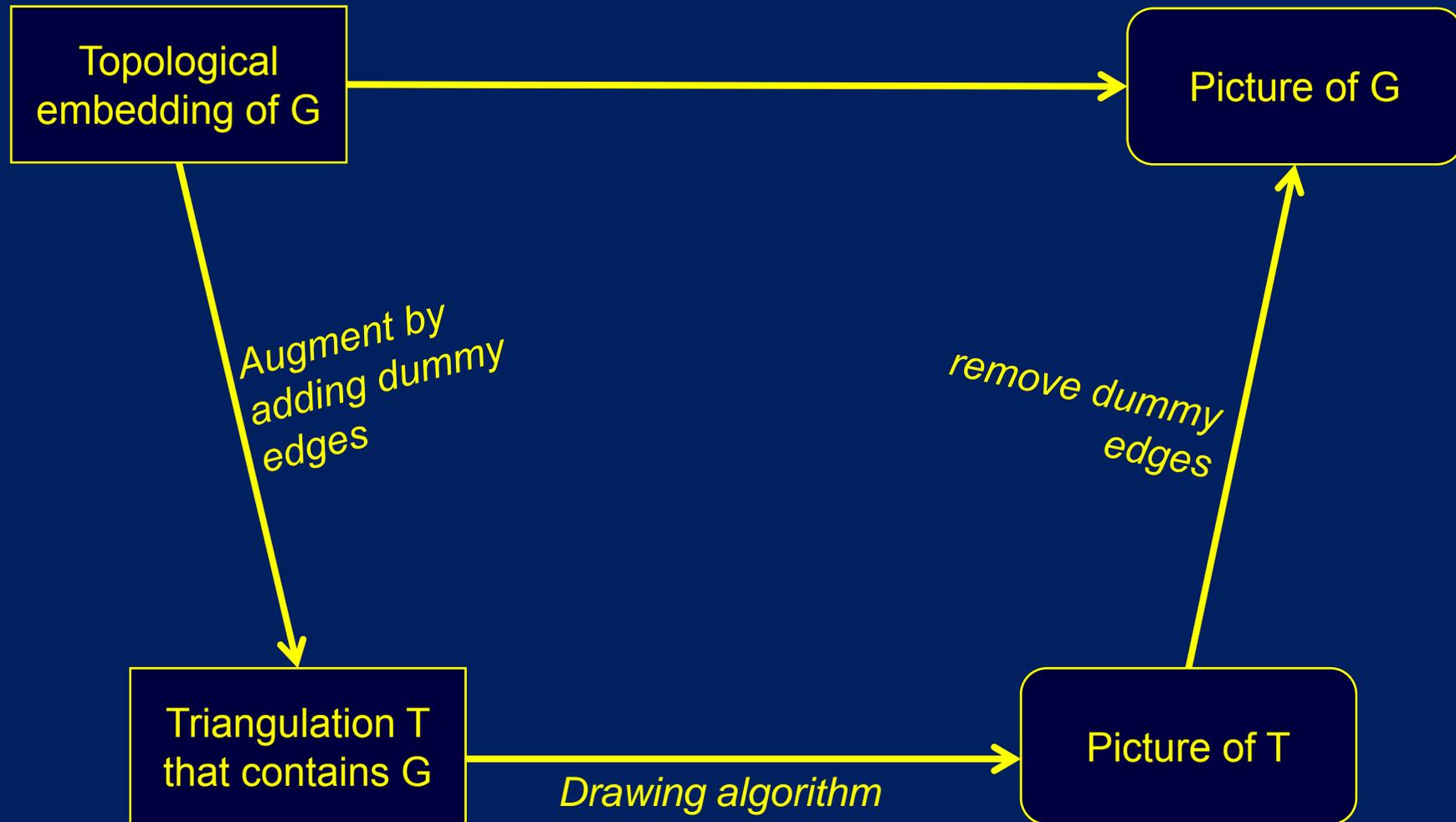
The deFraysseix-Pach-Pollack Theorem gave much hope for planarity-based methods, and many refinements appeared 1990 – 2000.

## de Fraysseix-Pach-Pollack-Chrobak Algorithm

1. Add dummy edges to make the graph into a triangulation
2. Construct an ordering  $u_1, u_2, \dots, u_n$  of the vertices, called the *canonical ordering*.
3. Draw the graph, adding one vertex at a time, in order  $u_1, u_2, \dots, u_n$

## Wikipedia proof of Fáry's Theorem

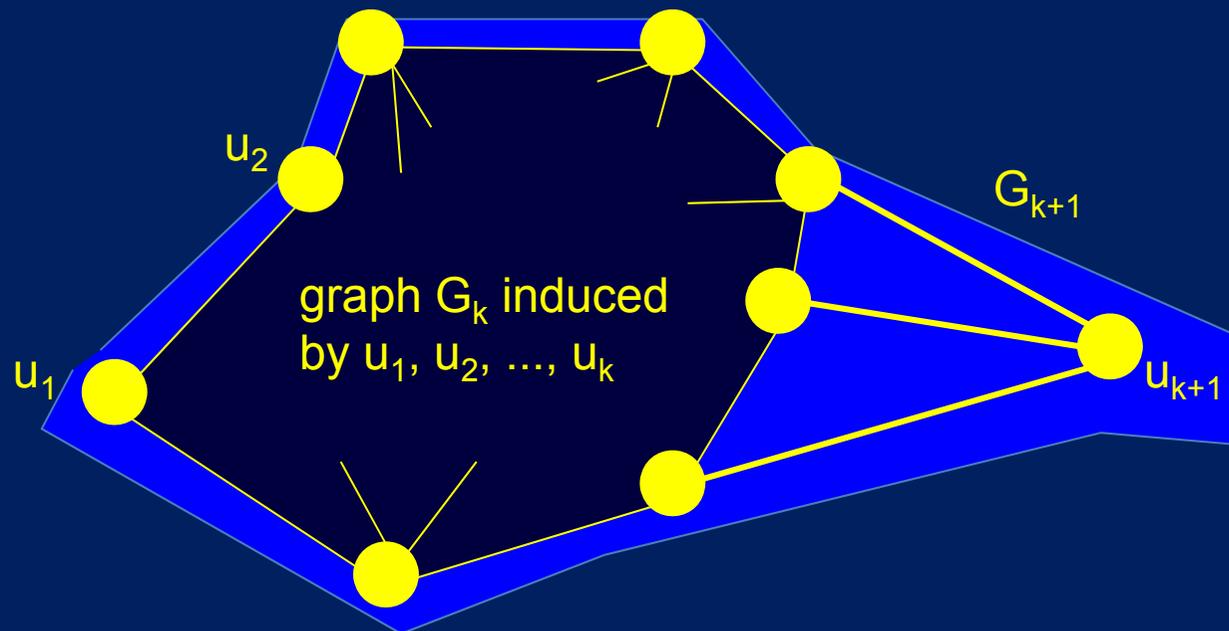
Step 1: Add dummy edges to make the graph into a triangulation



Step 2: Construct an ordering  $u_1, u_2, \dots, u_n$  of the vertices, called the “canonical ordering”.

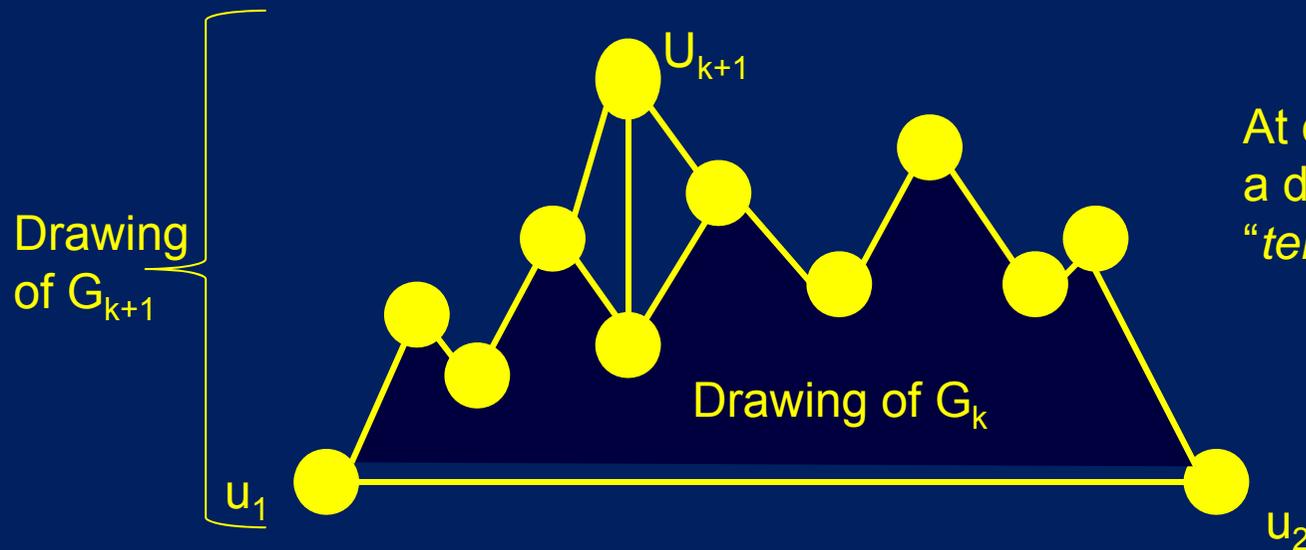
A canonical ordering is an ordering  $u_1, u_2, \dots, u_n$  of the vertices of a triangulation having the property that, for each  $3 \leq k < n$ , the graph  $G_k$  induced by  $u_1, u_2, \dots, u_k$  has the following properties

- $G_k$  is biconnected
- $G_k$  contains the edge  $(u_1, u_2)$  on its outer face,
- Any vertices in  $G_k$  adjacent to  $u_{k+1}$  are on the outer face of  $G_k$
- The vertices in  $G_k$  adjacent to  $u_{k+1}$  form a path along the outer face of  $G_k$



Step 3: Draw the graph, adding one vertex at a time in order  $u_1, u_2, \dots, u_n$

- a) Start with the edge  $(u_1, u_2)$  at  $y=0$
- b) For each  $k>1$ :
  - add  $u_{k+1}$  on  $y=k$
  - Choose  $x$  coordinate of  $u_{k+1}$  so that there are no edge crossings.



At each stage, there is a drawing of  $G_k$  as a "terrain".

Some details of deFraysseix-Pach-Pollack-Chrobak algorithm are needed to show

- It runs in linear time
- It is possible to avoid edge crossings
- Each vertex lies on an integer grid of size at most  $4n \times 2n$

Also:

For restricted classes of planar graphs, there are algorithms with better resolution, for example:

- Outerplanar graphs: algorithms with output with area  $\min(k_1 n^{1.48}, k_2 dn \log n)$  (Fрати 2009)

And some lower bounds:

- Planar graphs: area  $\Omega(n^2)$  is necessary (Leighton(?), about 1970)
- Series-parallel graphs:  $\Omega\left(n 2^{\sqrt{\log n}}\right)$  is necessary (Fрати, 2010)

## The deFraysseix-Pach-Pollack-Chrobak algorithm

### ***Efficiency:***

- Yes, linear time

### ***Elegance:***

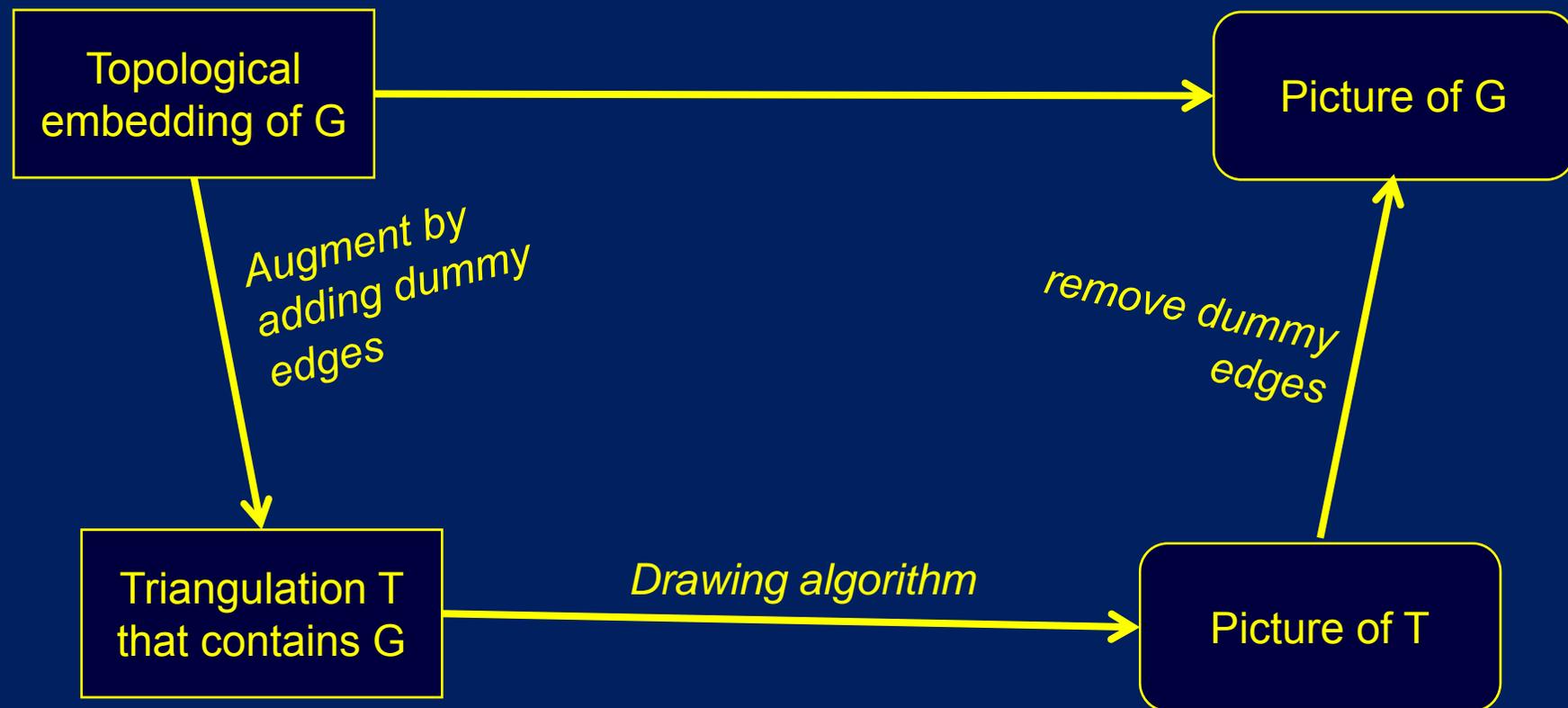
- Not bad; can be coded by a student in a week or so.

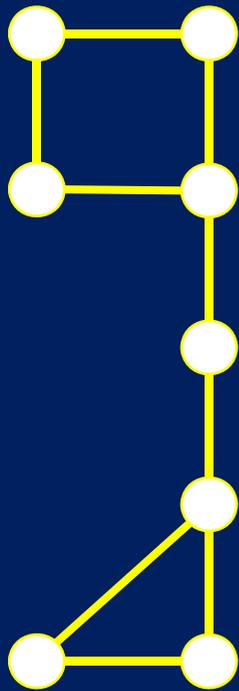
### ***Effectiveness:***

- Maybe pretty good:
  - Straight-line edges
  - No edge crossings
  - Good vertex resolution
  - But unfortunately -->

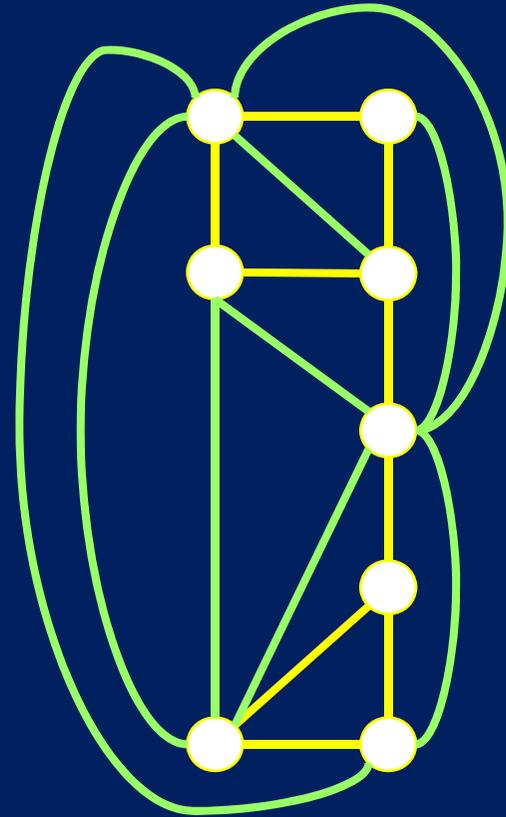
The deFraysseix-Pach-Pollack-Chrobak algorithm gave much hope for planarity-based methods, and many refinements appeared 1990 – 2000.

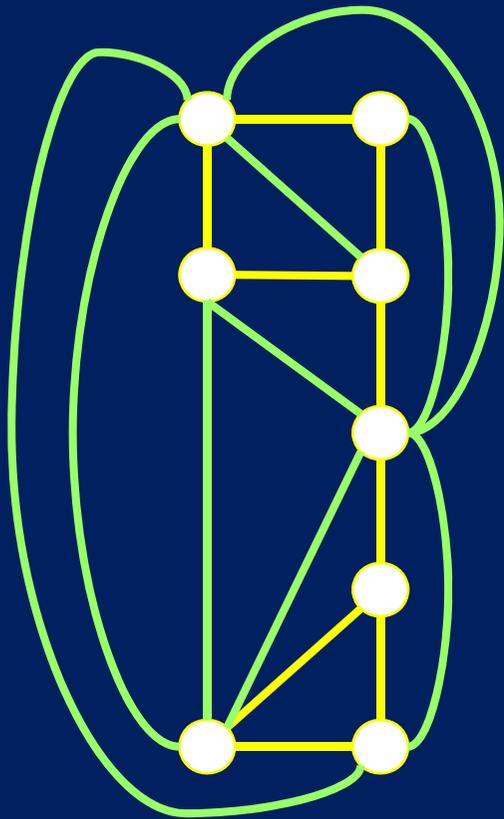
But unfortunately, we found that the first step (increasing connectivity by triangulation) gives some problems.



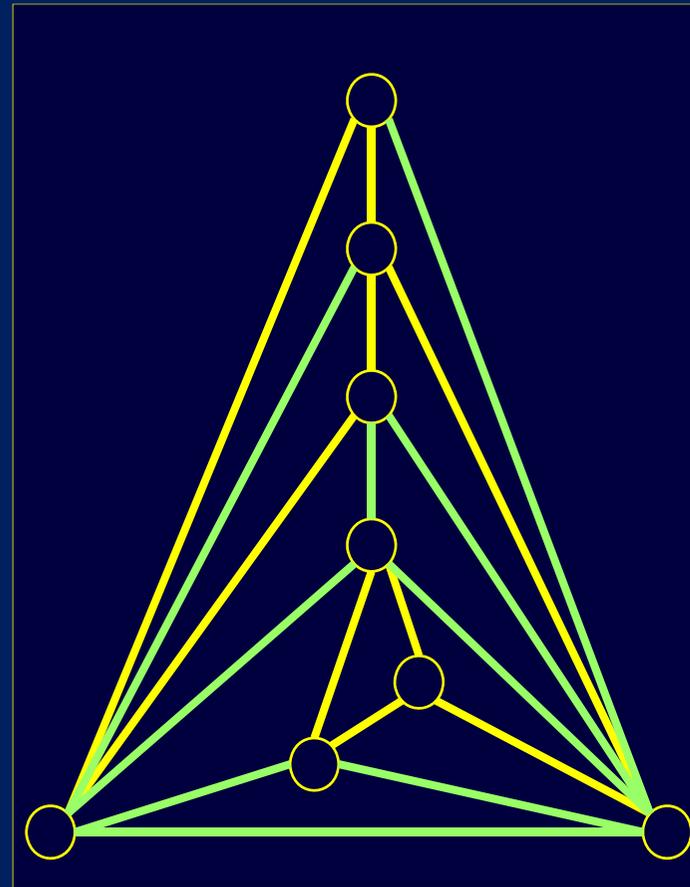


1. Add dummy edges to triangulate

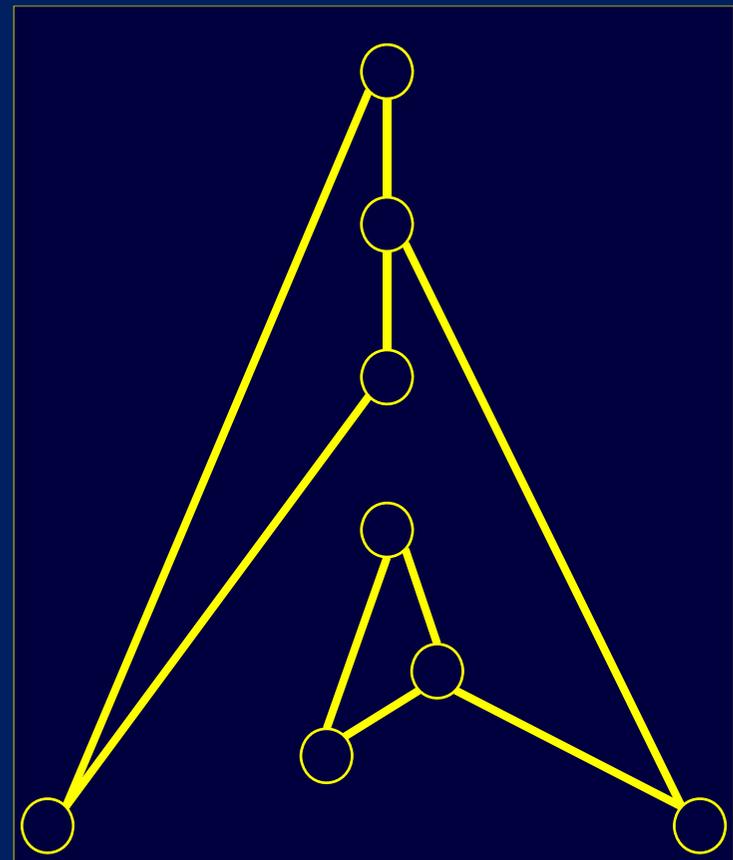
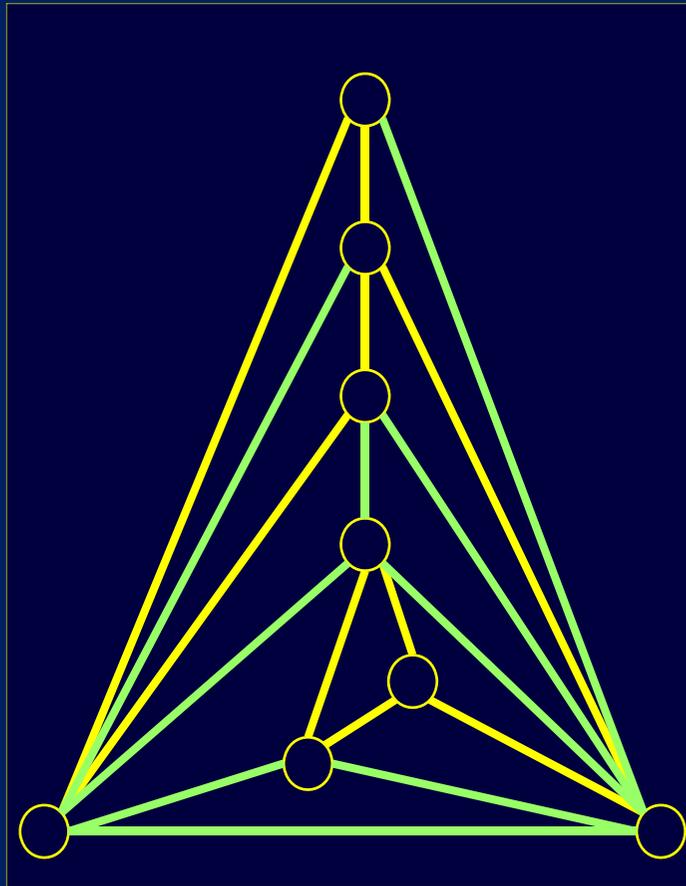




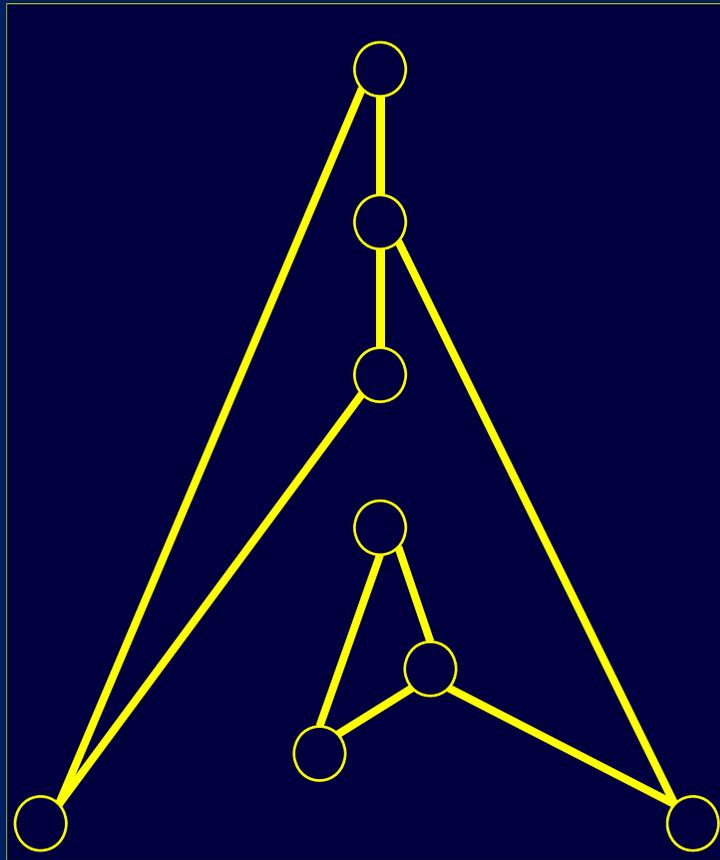
2. Draw the augmented graph.



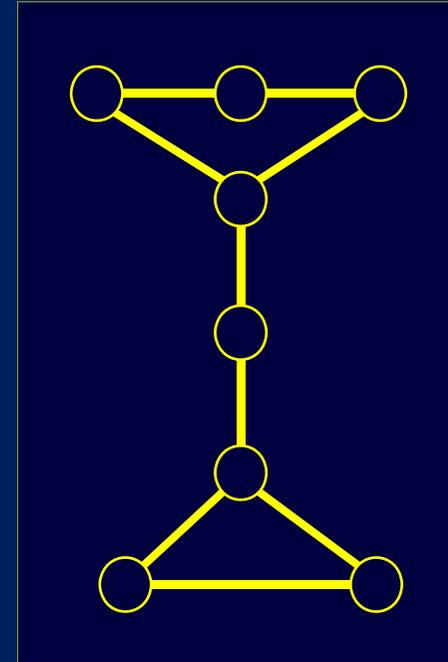
### 3. Delete the dummy edges



Note: the resulting drawing is ugly.



A better drawing



This kind of ugly drawing is a typical output from methods that use augmentation to increase connectivity

## The deFraysseix-Pach-Pollack-Chrobak algorithm

### ***Efficiency:***

- Yes, linear time

### ***Elegance:***

- Not bad; can be coded by a student in a week or so.

### ***Effectiveness:***

- So-so
  - Straight-line edges
  - No edge crossings
  - Good vertex resolution
  - Augmentation step gives poor angular resolution and weird shapes

## Aside

What if the input graph is non-planar?

Classical approach: *planarization*

*Input: a graph  $G = (V, E)$*

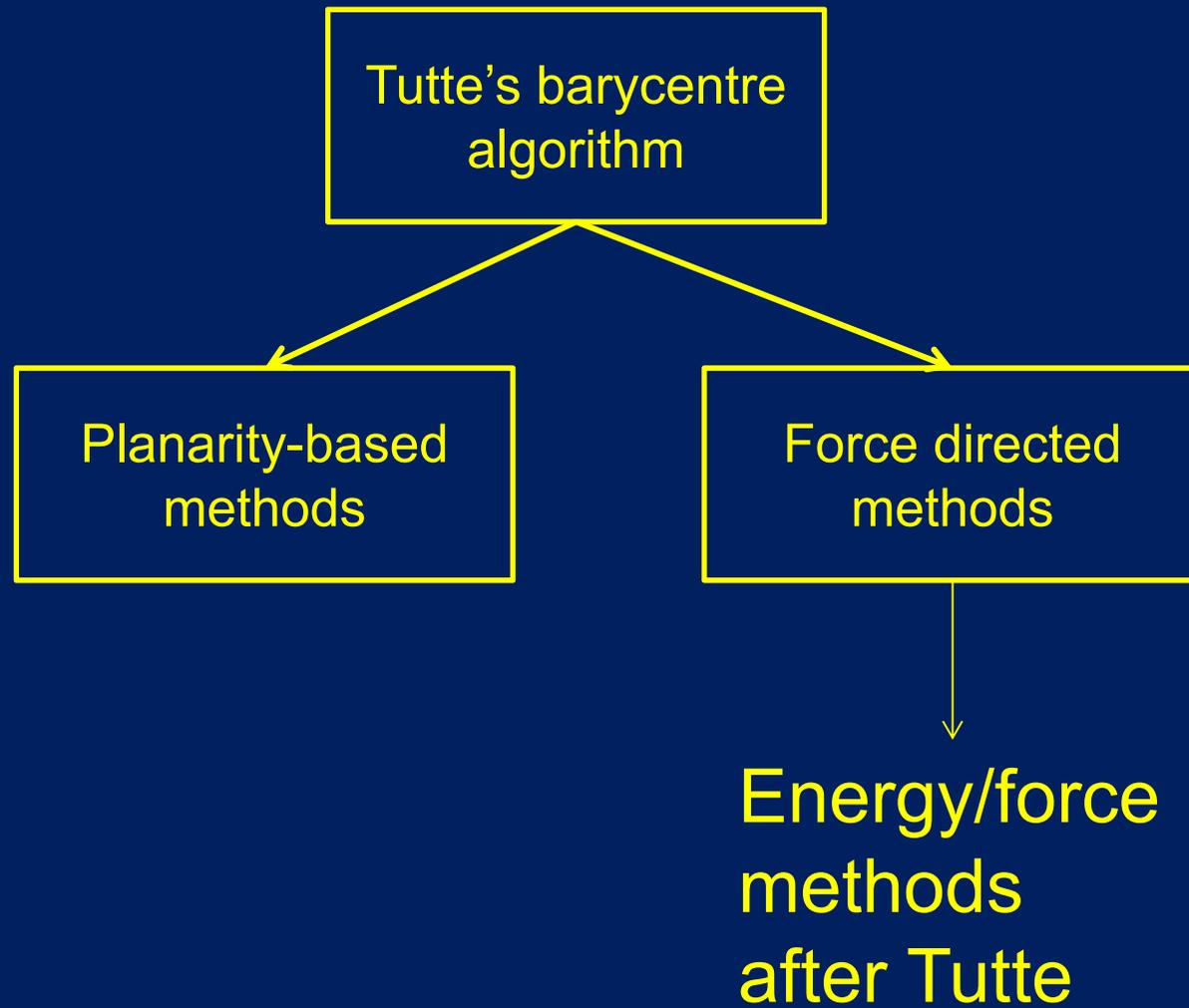
1. Find an approximately maximal planar subgraph  $G' = (V, E')$  with  $E' \subseteq E$ .
2. Find a topological embedding of  $G'$ .
3. Route each edge  $e \in E - E'$  in such a way to locally minimise crossings.
4. Put dummy vertices at each crossing point, to give a vertex set  $V'$  with  $V \subseteq V'$ .
5. The graph  $G'' = (V', E'')$  is then planar. Use a planarity-based drawing algorithm to draw  $G''$ .

*Current state-of-the-art for planarity based methods:*

- There are many small improvements to the deFraysseix-Pach-Pollack-Chrobak algorithm.
- But none have overcome all the connectivity augmentation problem.

*Current state-of-the-art for planarity based methods:*

- *Almost no planarity based methods* have been adopted in commercial software ... despite the fact that planarity is the single most important aesthetic criterion.



Tutte's algorithm gives poor vertex resolution: vertices can be exponentially close to each other.

To solve this problem, we need to prevent vertices from becoming very close together.

This can be done with forces:-

1. Use springs of nonzero natural length
2. Use an inverse square law repulsive force between nonadjacent vertices.

Force exerted by a vertex  $v$  on a vertex  $u$ :

If  $u$  and  $v$  are adjacent:

$$f_{spring}(u, v) = k_{uv}(d(u, v) - q_{uv})i_{uv}$$

where

- $k_{uv}$  is the *strength* of the spring between  $u$  and  $v$
- $d(u, v)$  is the Euclidean distance between  $u$  and  $v$
- $q_u$  is the *natural length* of the  $u$ - $v$  spring
- $i_{uv}$  is a unit vector in the direction from  $u$  to  $v$ .

If  $u$  and  $v$  are not adjacent:

$$f_{nonadjac}(u, v) = \frac{r_{uv}}{d(u, v)^2} i_{uv}$$

where

- $r_{uv}$  is the *strength* of the repulsive force

Total force on a vertex  $u$ :

$$F(u) = \sum_{(u,v) \in E} f_{spring}(u,v) + \sum_{(u,w) \notin E} f_{nonadjac}(u,w).$$

A (locally) minimum energy configuration satisfies

$$F(u) = 0$$

for each vertex  $u$ .

This is a system of nonlinear equations.

Note

1. In general, the solution to this system of equations is not unique, that is, there are local minima that may not be global.
2. Many methods to solve systems of equations like this are available. Some methods are fast, some are slow, depending on the specific equations.

Force-based techniques can be constrained in various ways.

The constants in the force definitions

$$f_{spring}(u, v) = k_{uv}(d(u, v) - q_{uv})i_{uv}$$

$$f_{nonadjac}(u, v) = \frac{r_{uv}}{d(u, v)^2} i_{uv}$$

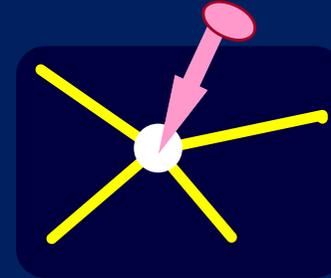
can be chosen to reflect the relationships in the domain.

For example

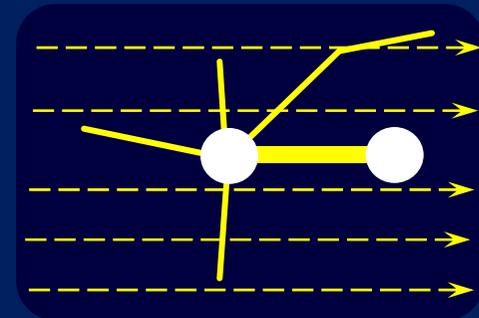
- If the edge between  $u$  and  $v$  is important in the domain, then we can choose  $k_{uv}$  to be large and  $q_{uv}$  to be small.

Force-based techniques can be constrained in various ways.

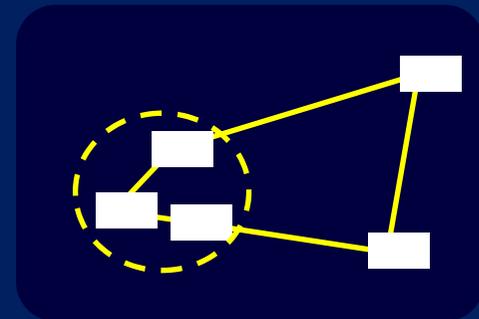
*Nails can be used to hold a node in place.*



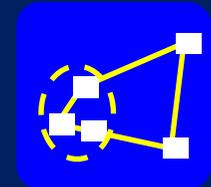
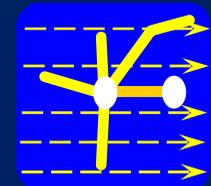
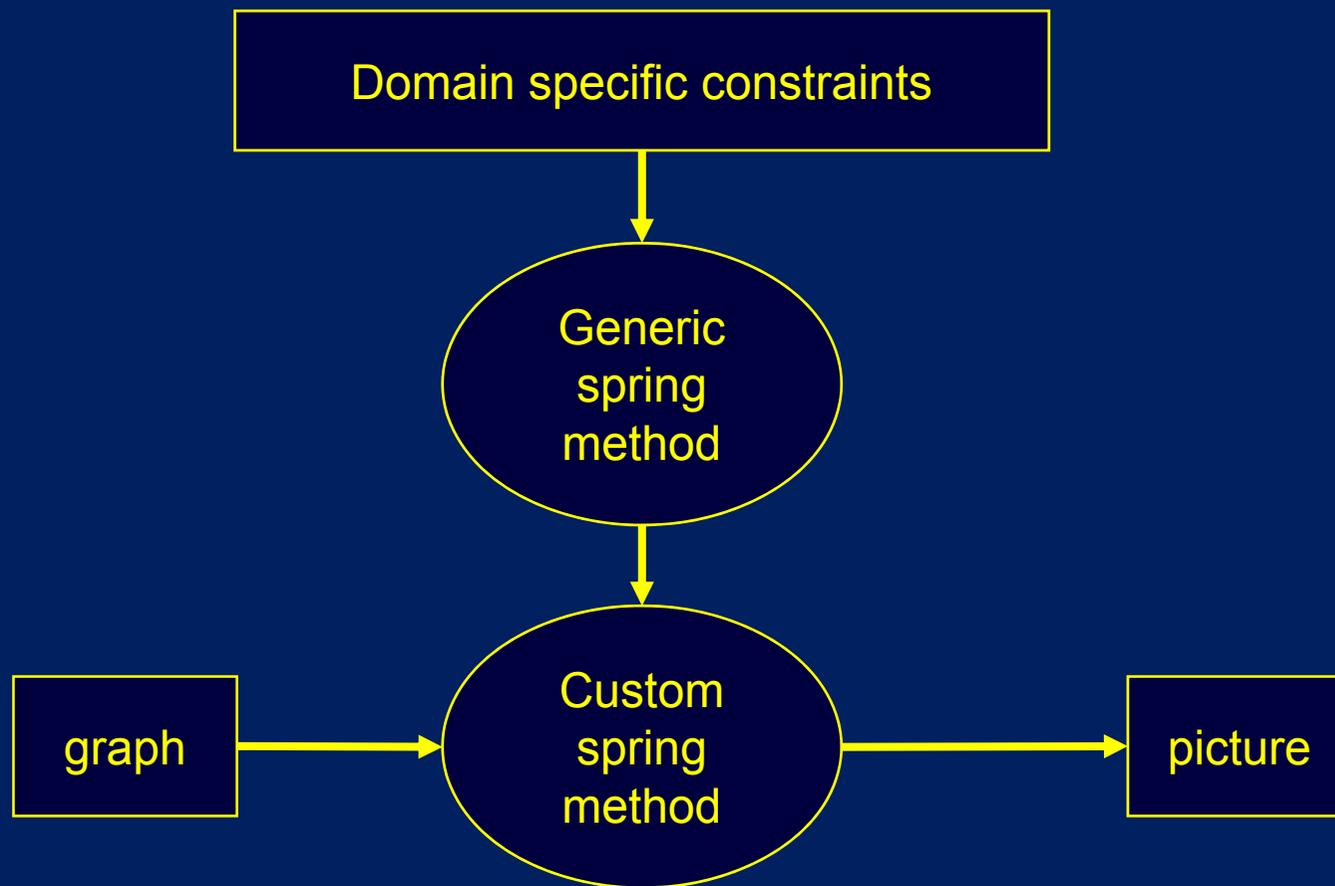
*Magnetic fields and magnetized springs can be used to align nodes in various ways.*

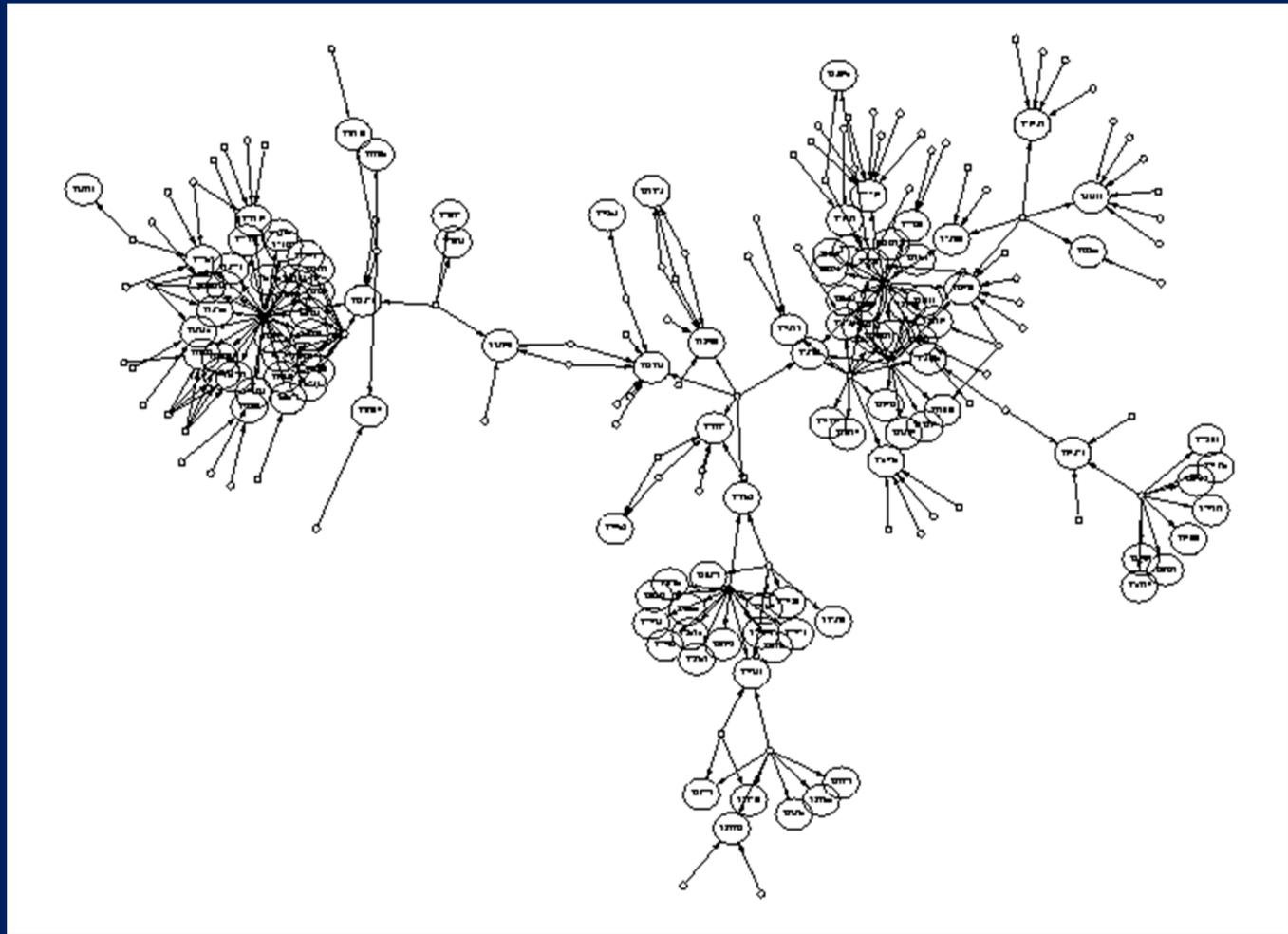


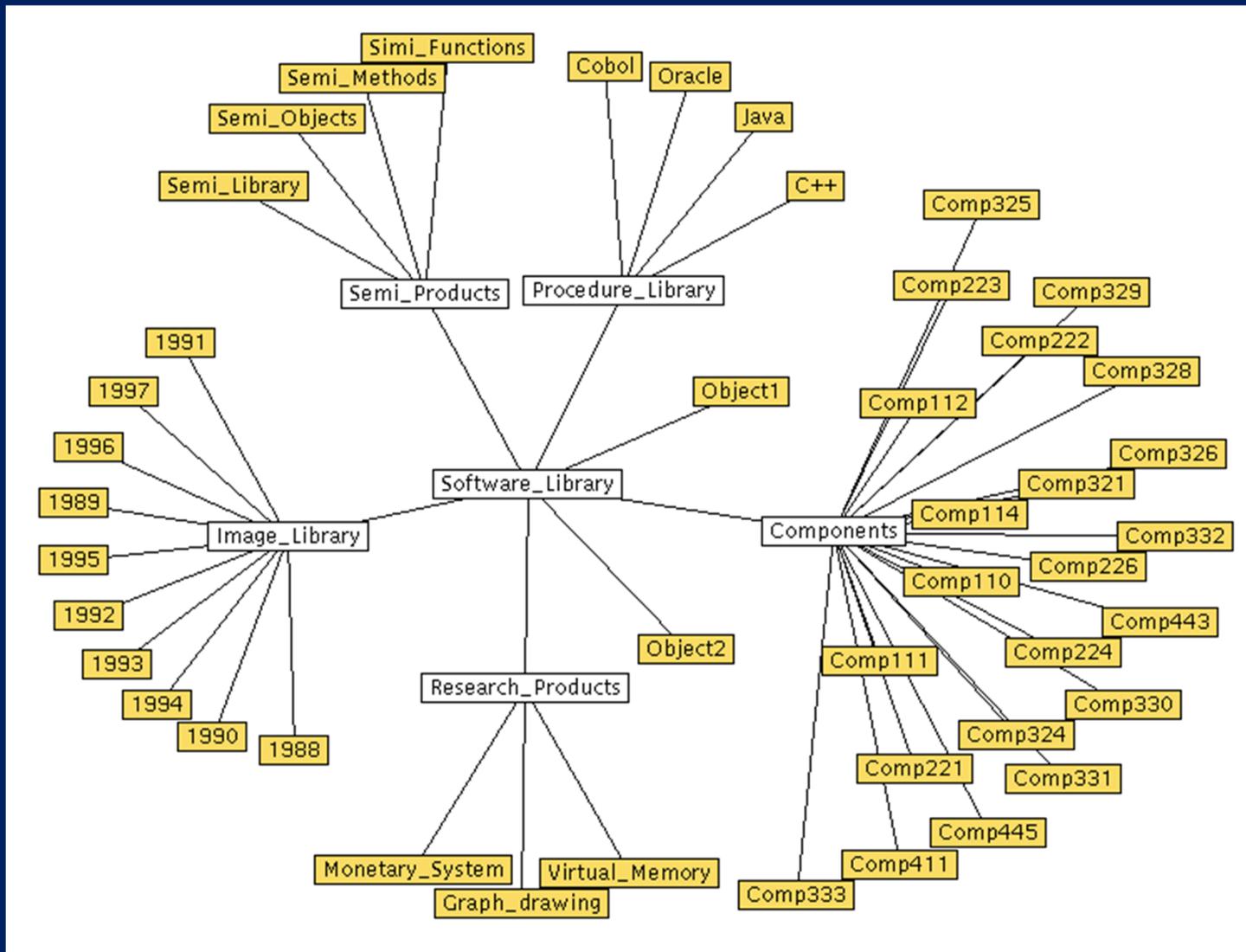
*Attractive forces can be used to keep clusters together.*



These constraints are very useful in customizing the general spring method to a specific domain.







Example:

*Metro Maps*

- *Damian Merrick*
- *SeokHee Hong*
- *Hugo do Nascimento*

## *The Metro Map Problem*

- Existing metro maps, produced by professional graphic artists, are ***excellent examples*** of network visualization
- *Challenge: Can we produce good metro maps automatically?*
- ***Possible solution:***
  - Use a force-directed approach
  - Define forces that map good layout to low energy

# CityRail Network









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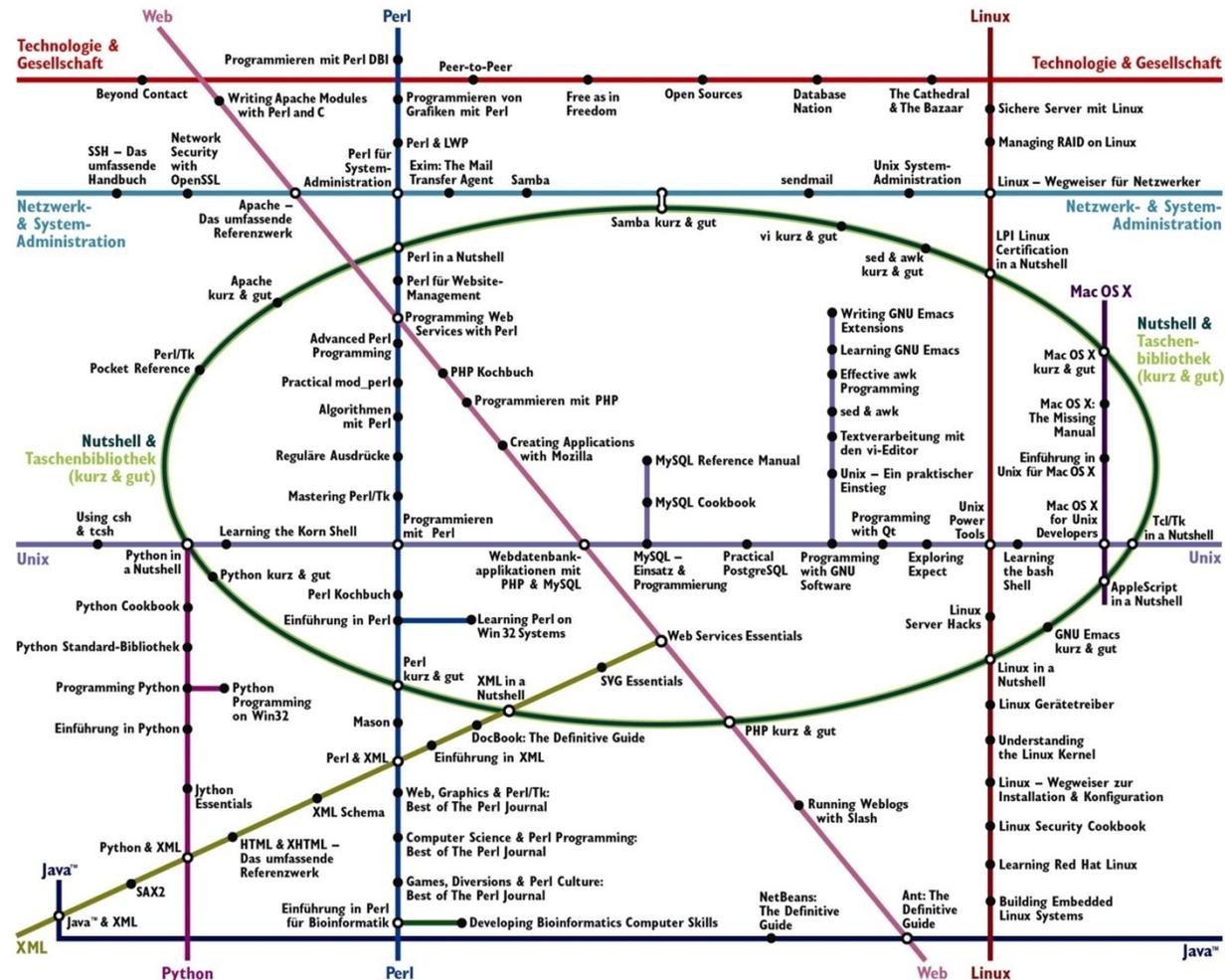
## LEGENDE

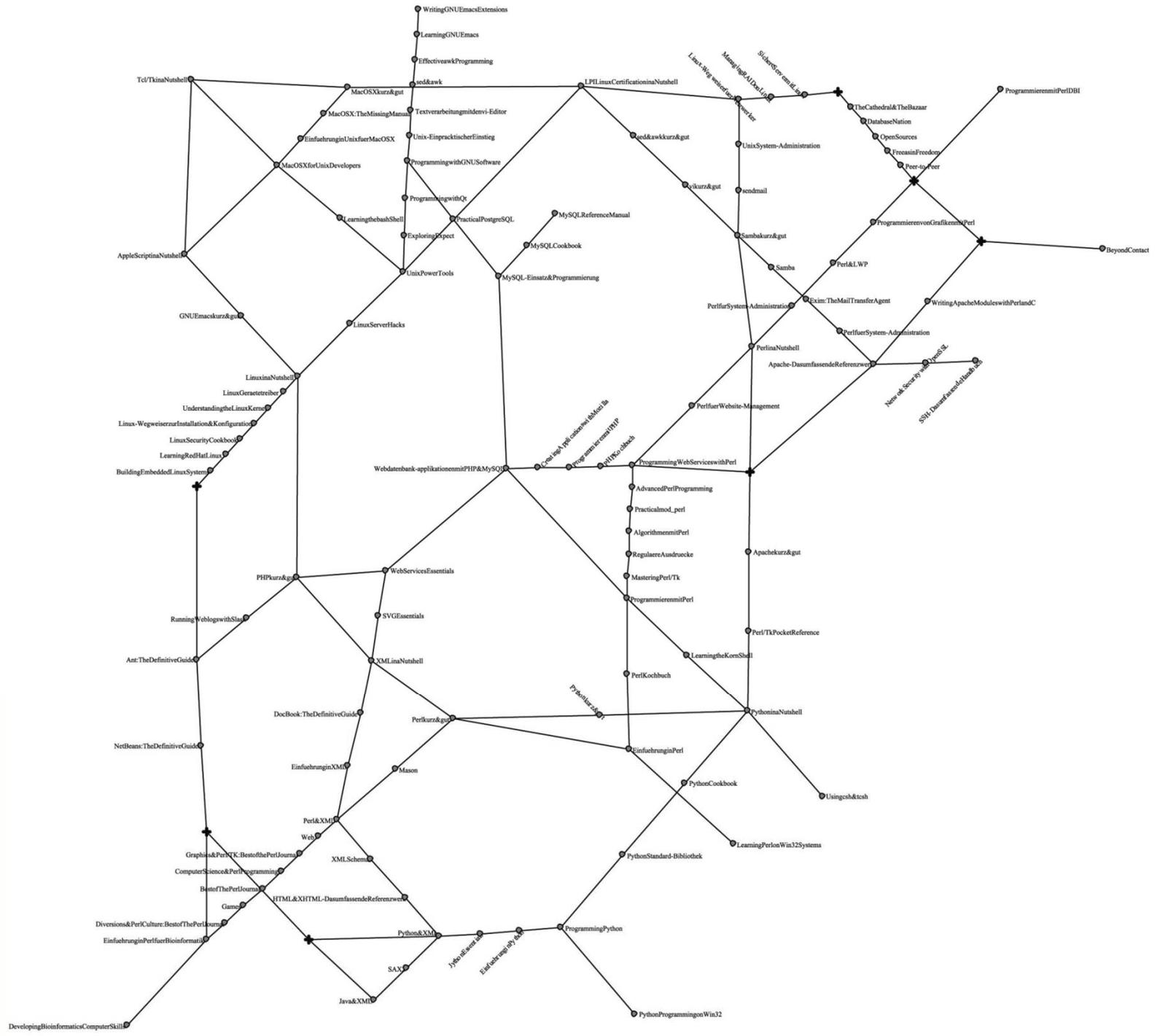
- Bioinformatik
- Java™
- Linux
- Mac OS X
- Netzwerk- & System-Administration
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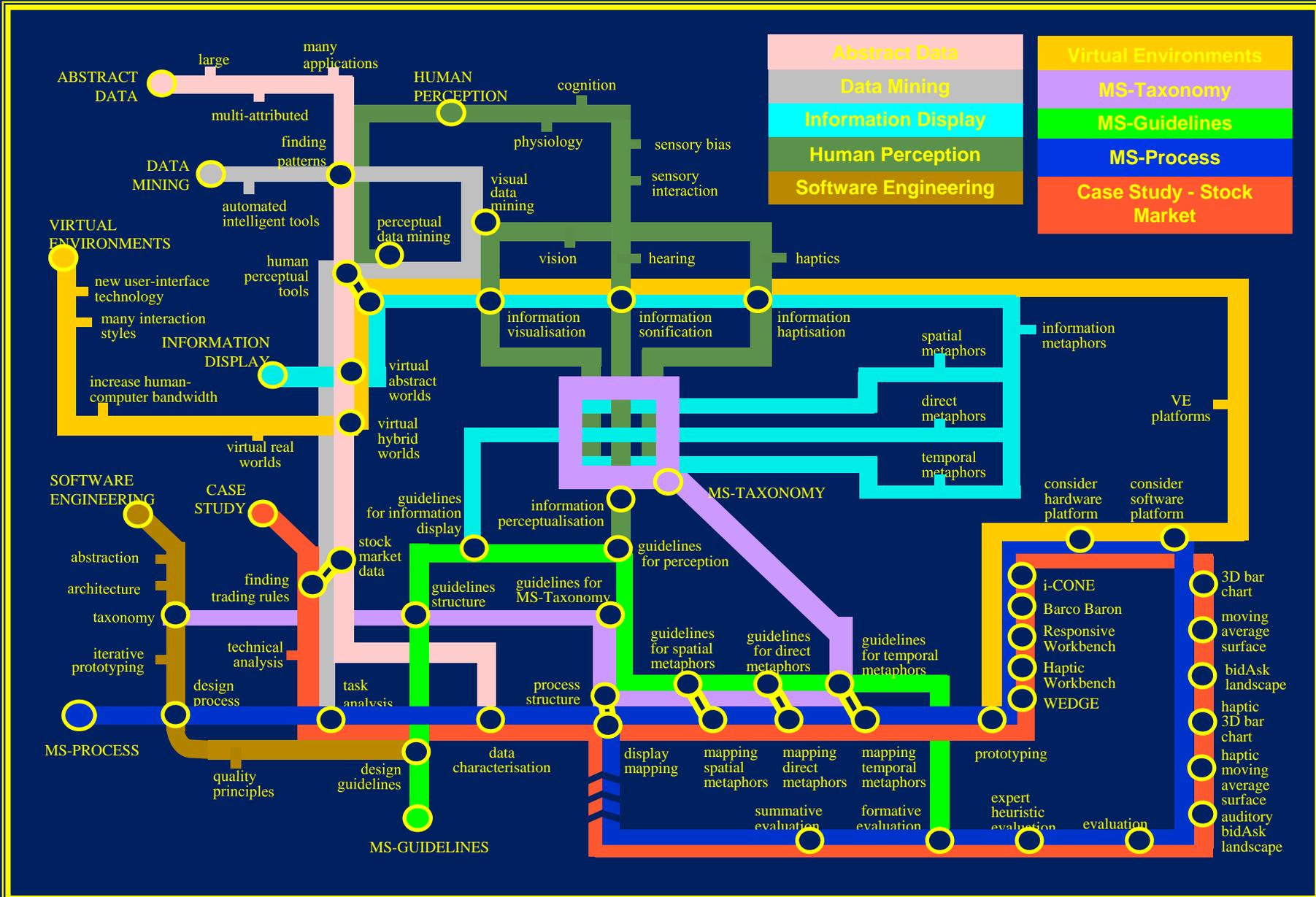
www.oreilly.de

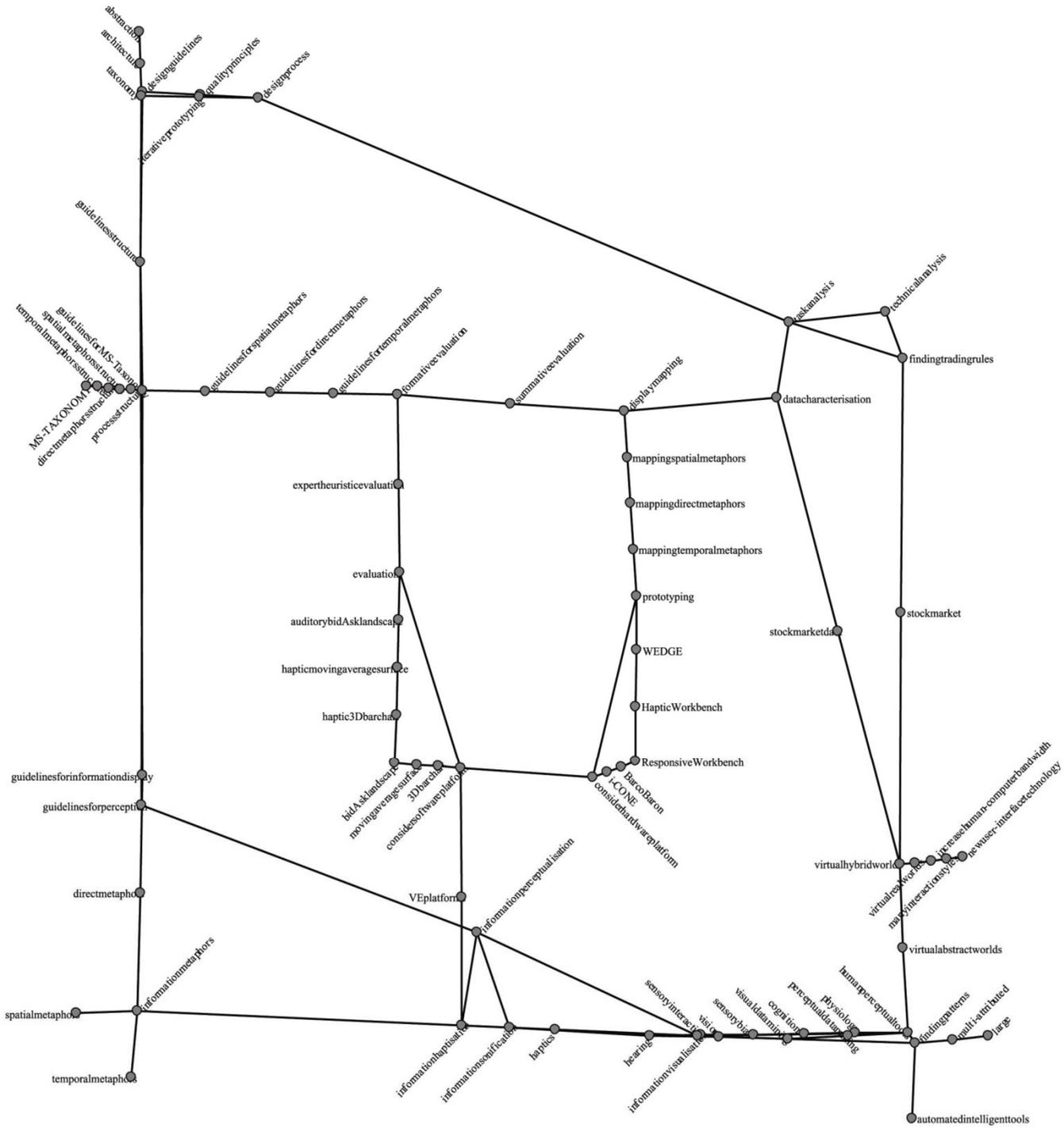
Die Grübelelei hat ein Ende!  
Bücher von O'Reilly

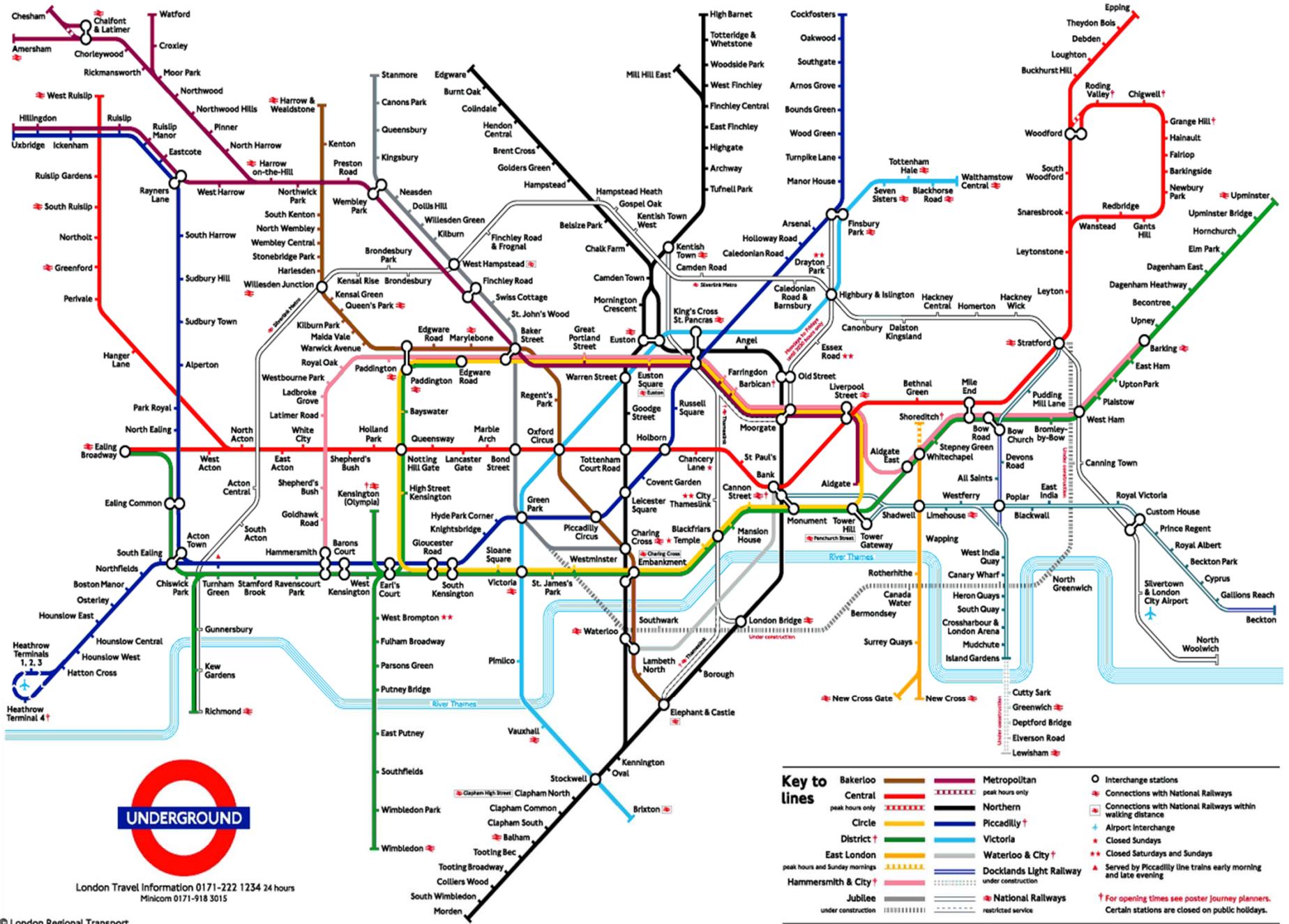
# 2003 OPEN SOURCE ROUTE MAP









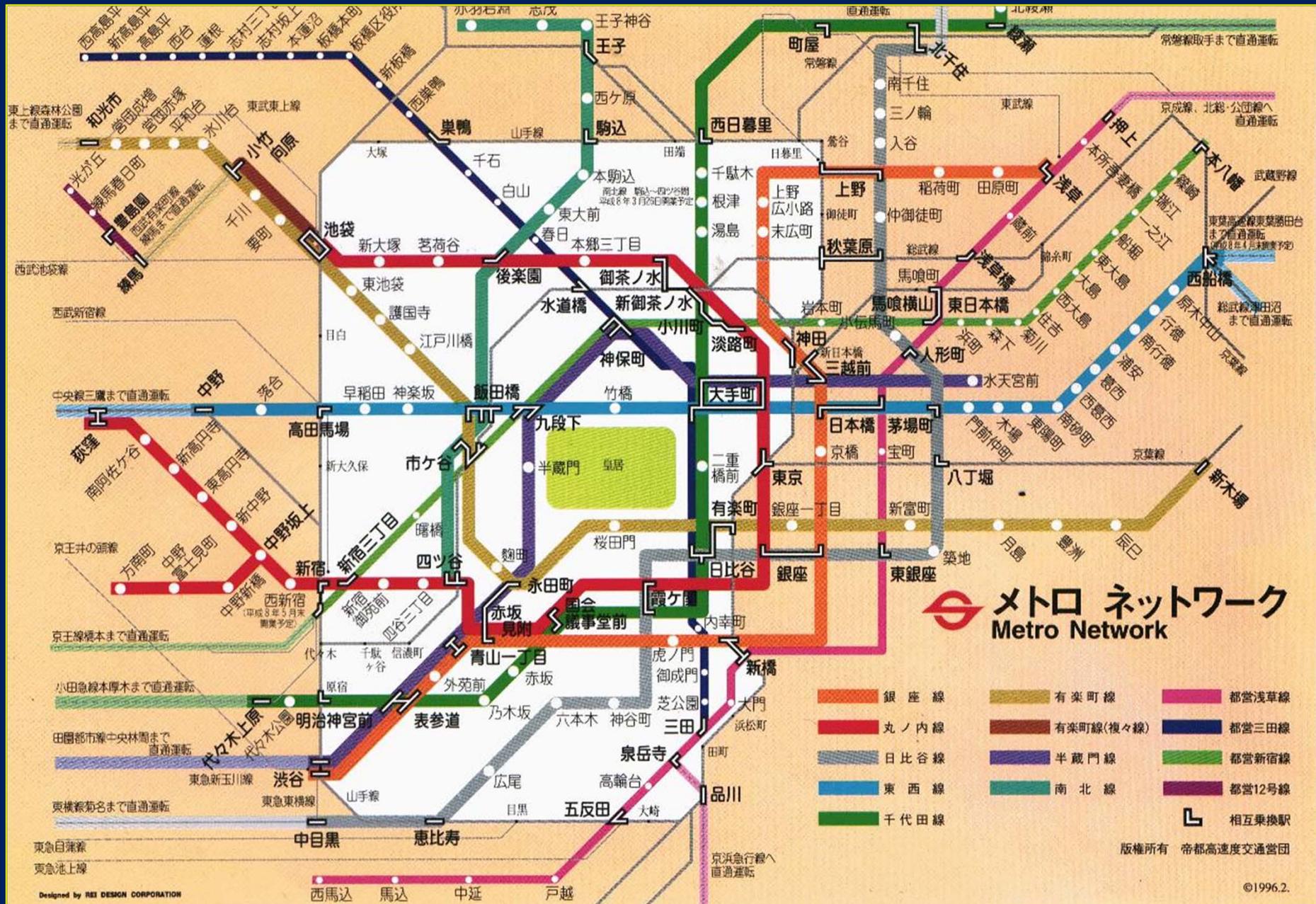


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**Key to lines**

Bakerloo	Metropolitan	○ Interchange stations
Central	Metropolitan peak hours only	⚡ Connections with National Railways
Circle	Northern	⚡ Connections with National Railways within walking distance
District †	Piccadilly †	✈ Airport Interchange
East London	Victoria	⚡ Closed Sundays
Hammersmith & City †	Waterloo & City †	⚡ Closed Saturdays and Sundays
Jubilee	Docklands Light Railway	⚡ Served by Piccadilly line trains early morning and late evening
under construction	under construction	† For opening times see poster Journey planners. Certain stations are closed on public holidays.
restricted service	National Railways	





**メトロ ネットワーク**  
**Metro Network**

- 銀座線
- 丸ノ内線
- 日比谷線
- 東西線
- 千代田線
- 有楽町線
- 有楽町線(複々線)
- 半蔵門線
- 南北線
- 都営浅草線
- 都営三田線
- 都営新宿線
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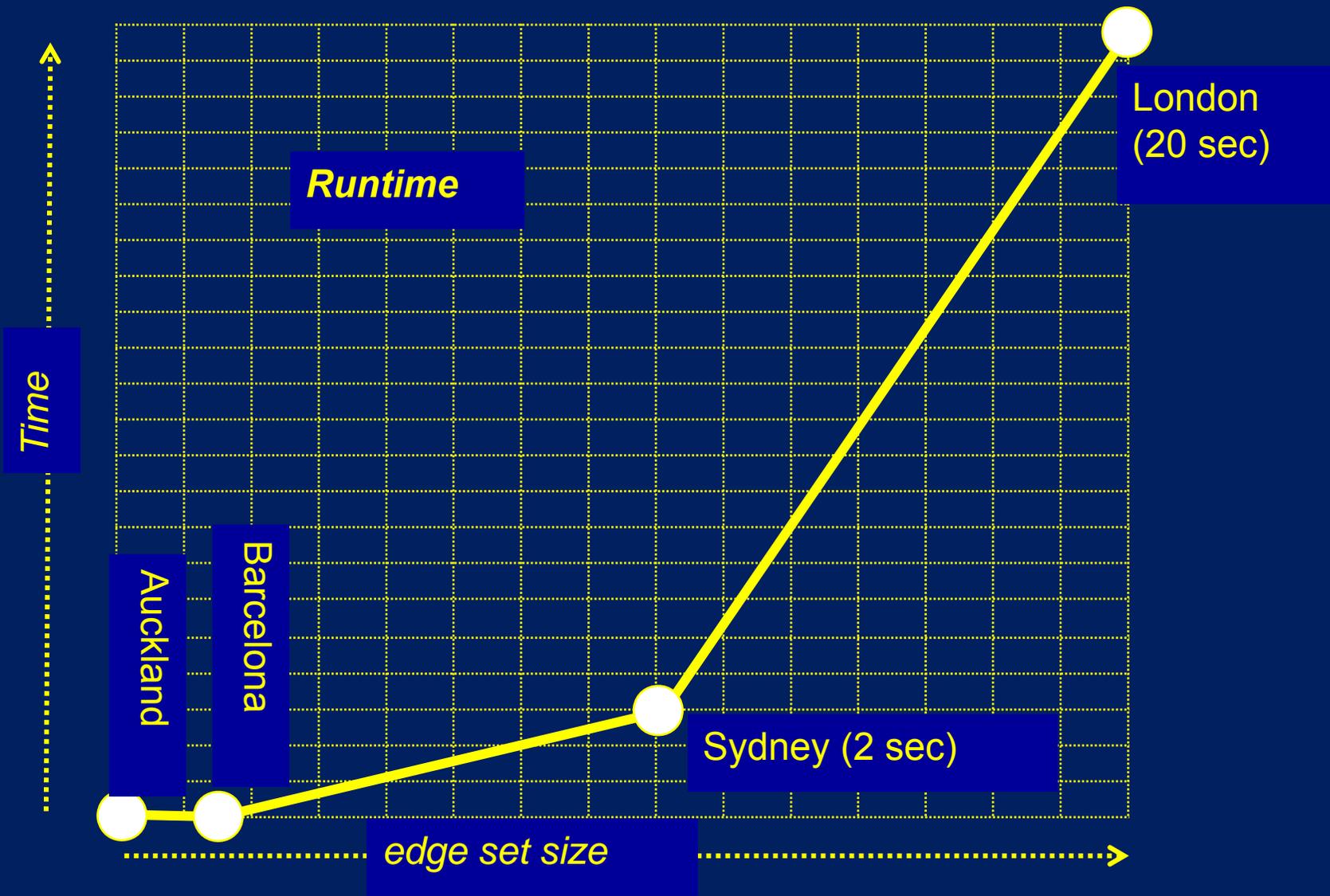
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Informal conclusion:

- The force directed method is a *little bit effective*, but *not very effective*.

# Efficiency



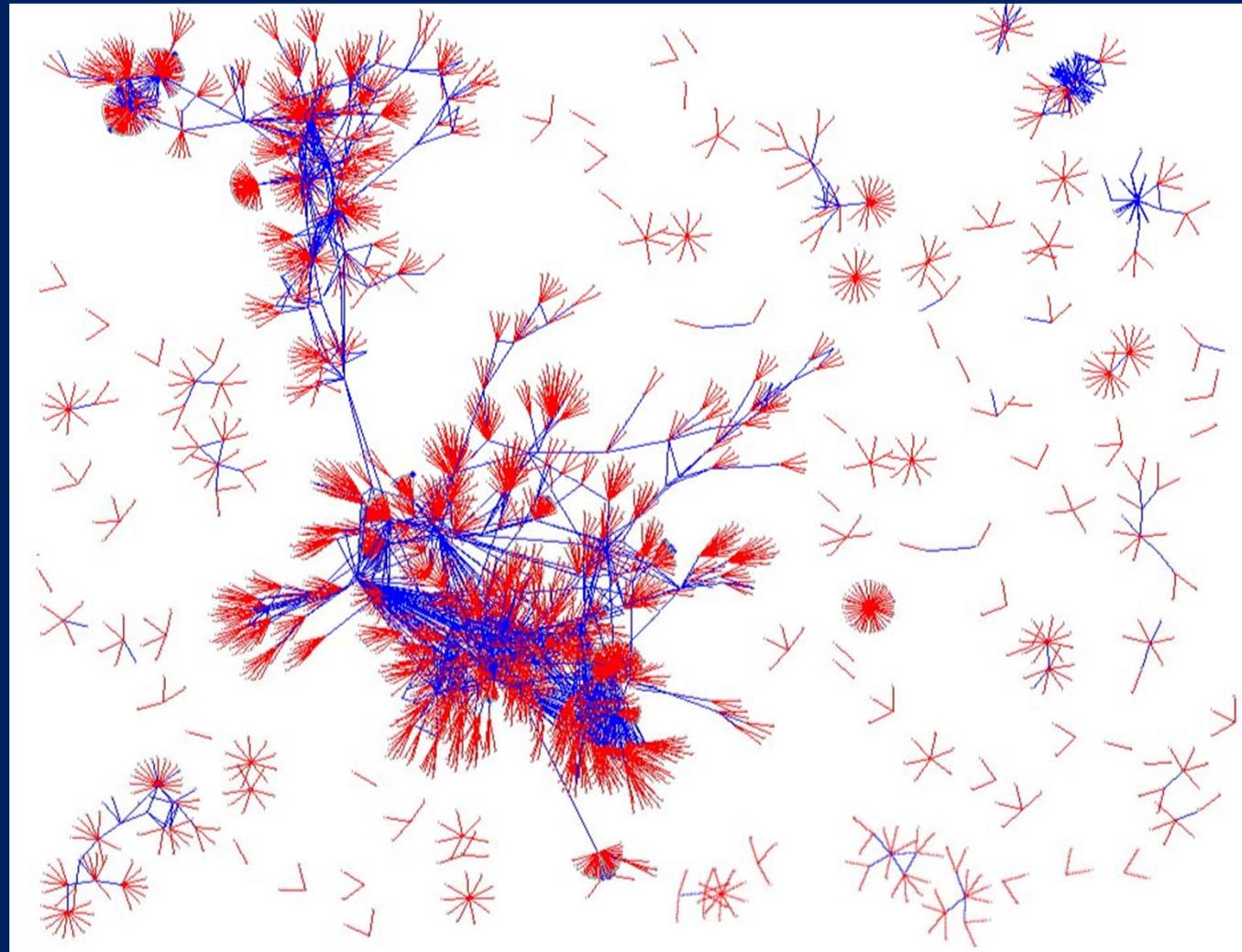
Informal conclusion:

- The force directed method for metro maps is not computationally efficient.

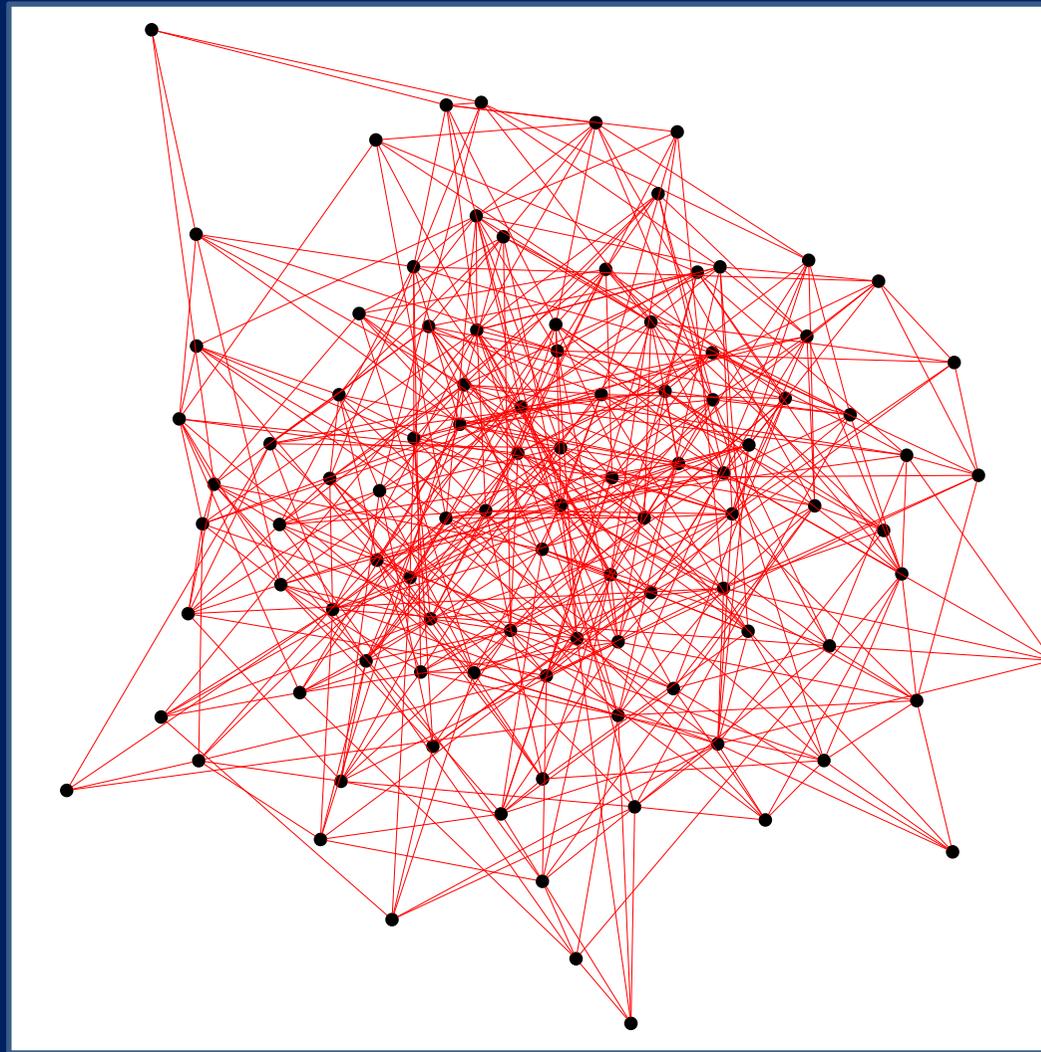
The performance of force directed methods on metro maps is typical  
force directed methods:

- Elegant and easy to implement
- Effective but not very effective
- Not very efficient

For some data sets, force directed methods give reasonably good drawings.



For some data sets, force directed methods  
give bad drawings.



## How good are current force directed methods?

### ***Elegance:***

- Many simple methods, easy to implement
- Numerical software often available

### ***Effectiveness:***

- Very flexible
- Straight-line edges
- Planar graphs are not drawn planar
- Very poor untangling for large graphs

### ***Efficiency:***

- OK for small graphs
- Sometimes OK for larger graphs (using sophisticated numerical methods)

## ***The commercial state-of-the-art for force directed methods:***

- Many commercial force-directed tools graph drawing methods are available
  - IBM (ILOG)
  - TomSawyer Software
  - yWorks
  
- Much free software available
  - GEOMI
  - GraphVis
  
- Many patents on variations of force-directed methods
  
- Force-directed methods account for 90% of commercial and free graph drawing software for undirected graphs

## ***The scientific state-of-the-art for force directed methods***

- Very few scientific human experiments have been done on the results of force directed methods.
- Very few theorems have been proven about force directed methods
  - Tutte's theorem
  - A theorem on symmetry of the output
  - Some theorems on multidimensional scaling can be applied.
- Some empirical comparisons (in terms of hard metrics) have been done.
- Many informal (unscientific?) investigations have been done
  - Appeal to developer intuition
  - Case studies in context

## Tutte's barycentre algorithm

```
graph TD; A[Tutte's barycentre algorithm] --> B[Planarity-based methods]; A --> C[Force directed methods];
```

### Planarity-based methods

- Good underpinning by theory
  - ✓ Mathematical
  - ✓ Psychological
- Strong empirical evidence of quality
- Seldom used in practice
- No patents
- Planarity algorithms can be difficult to code

### Force directed methods

- Not many scientific assertions of quality
- Very little empirical validation
- Almost no underlying theory
- Universally used in practice
- Many patents
- Many force-directed methods are easy to code
- Flexible, can easily accommodate constraints

## 2. How to draw a planar graph?

- a) Before Tutte: 1920s – 1950s
- b) Tutte: 1960s
- c) After Tutte: 1970s – 1990s
- d) Recent work

## Recent work

- *slightly non-planar graphs*

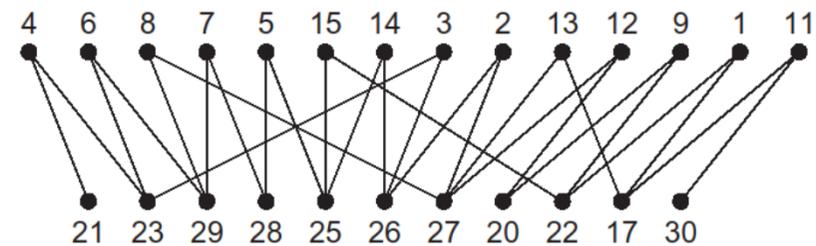
## Motivation

### Mutzel experiment 1997 - 98

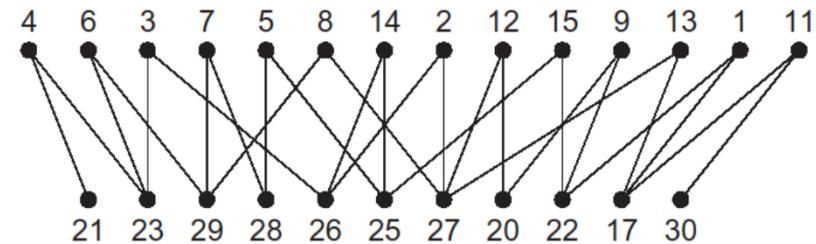
- Informal “experiment”, performed at a talk
- Audience members were the “subjects”

### Results

- People prefer (a) over (b)
- People erroneously see (a) as having fewer crossings than (b)



(a)

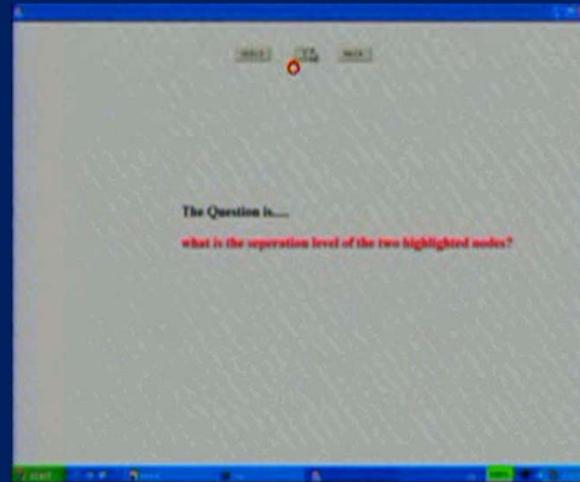
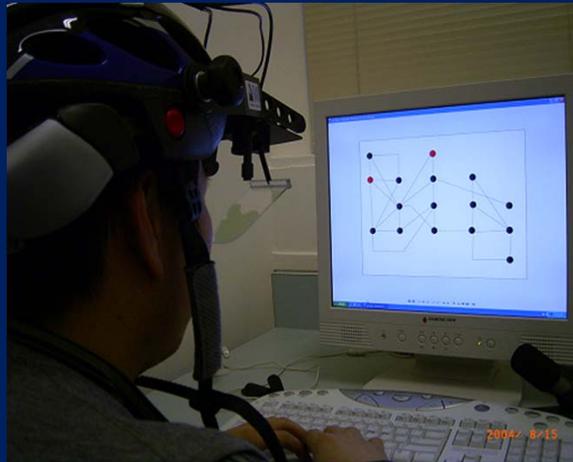


(b)

## Motivation

Tony Huang 2003+

- Series of formal human experiments using eye-tracking.



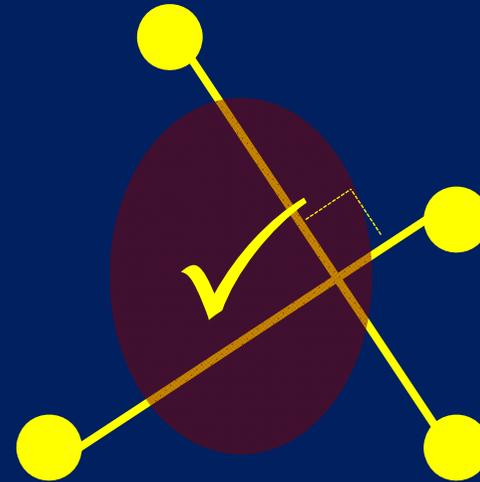
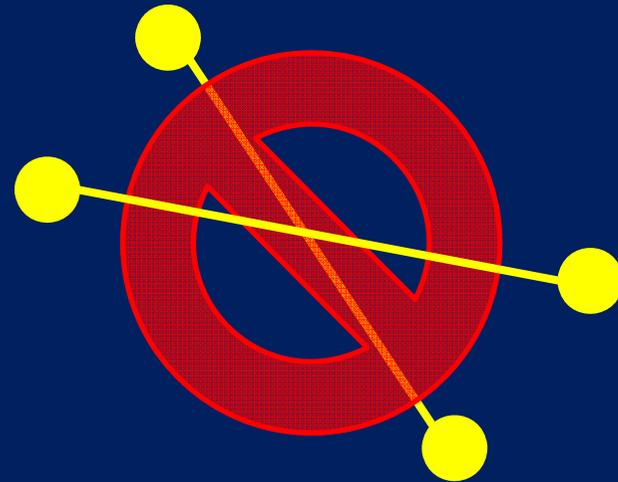
Huang's thesis

*If the crossing angles are large, then non-planar drawings are OK.*

# Slightly non-planar graphs

Right-Angle Crossing (RAC) graphs:

- Straight-line edges
- If two edges cross, then the crossing makes a right angle



Questions for slightly non-planar graphs:

- How dense can a RAC graph be?

Theorem (Liotta, Didimo, Eades, 2009)

Suppose that  $G$  is a RAC graph with  $n$  vertices and  $m$  edges.  
Then  $m \leq 4n - 10$ .

Questions for slightly non-planar graphs:

- How dense can a RAC graph be?
- How can you compute a drawing of a RAC graph?

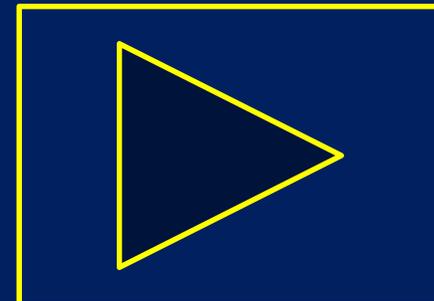
*Theorem (Liotta, Eades, unpublished\*)*

*The following problem is NP-hard:*

*Input: A graph  $G$*

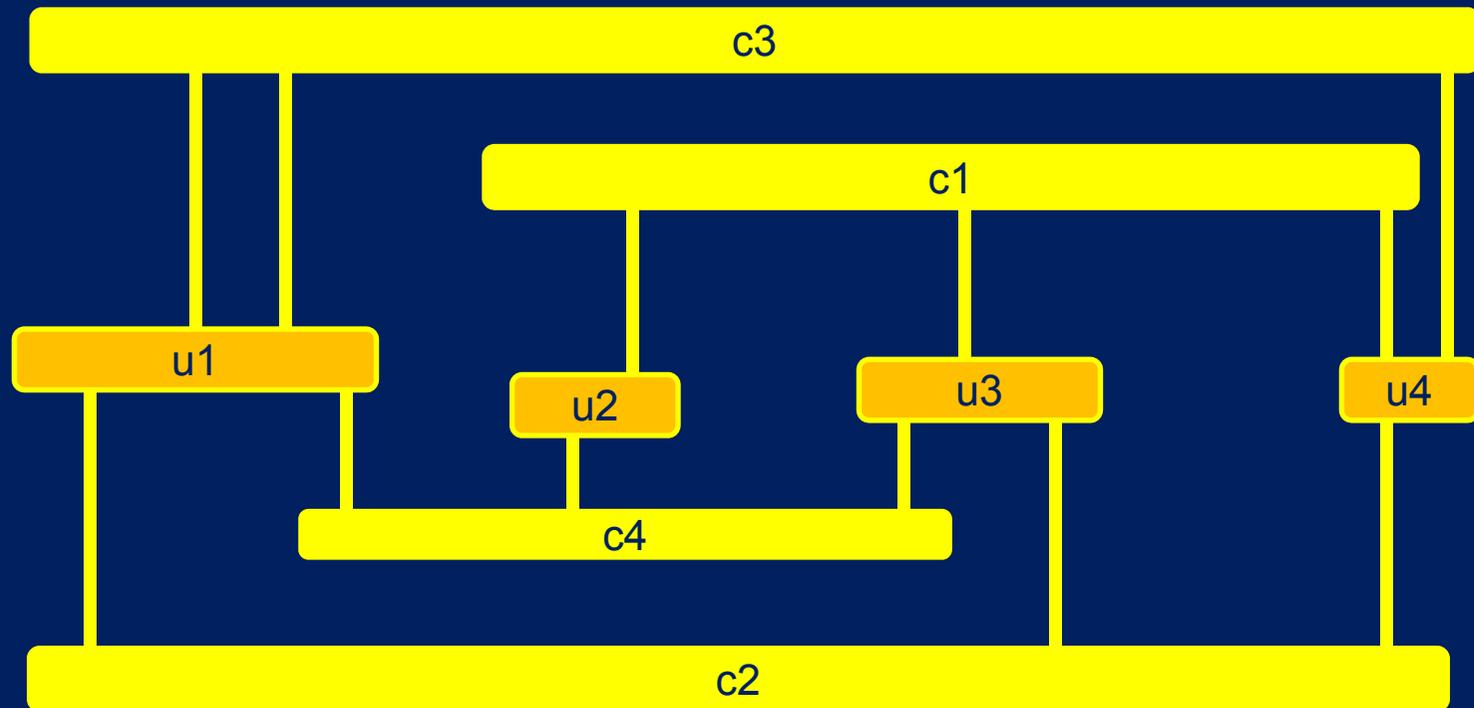
*Question: Is there a straight-line RAC drawing of  $G$ ?*

\*Independently proved and published by Argyriou, Bekos and Symvonis



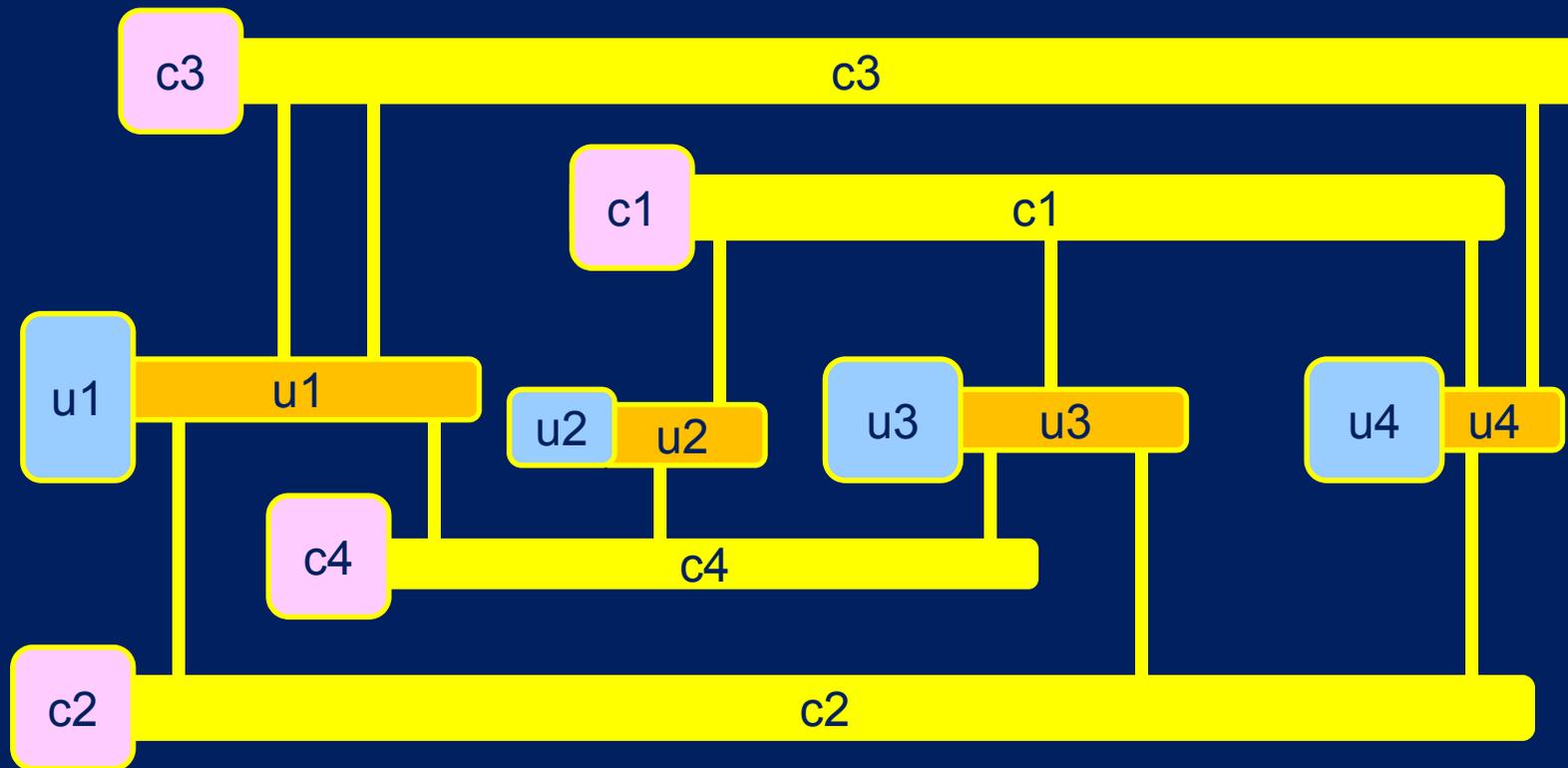
## Proof

- Reduction from planar-3-sat
- Draw the instance  $H$  of planar-3-sat as a template
- Fill in details of the template  $H$  to form a graph  $G$  that has a RAC drawing if and only if  $H$  is satisfiable.
- Fairly generic proof strategy for NP-hardness for layout problems.



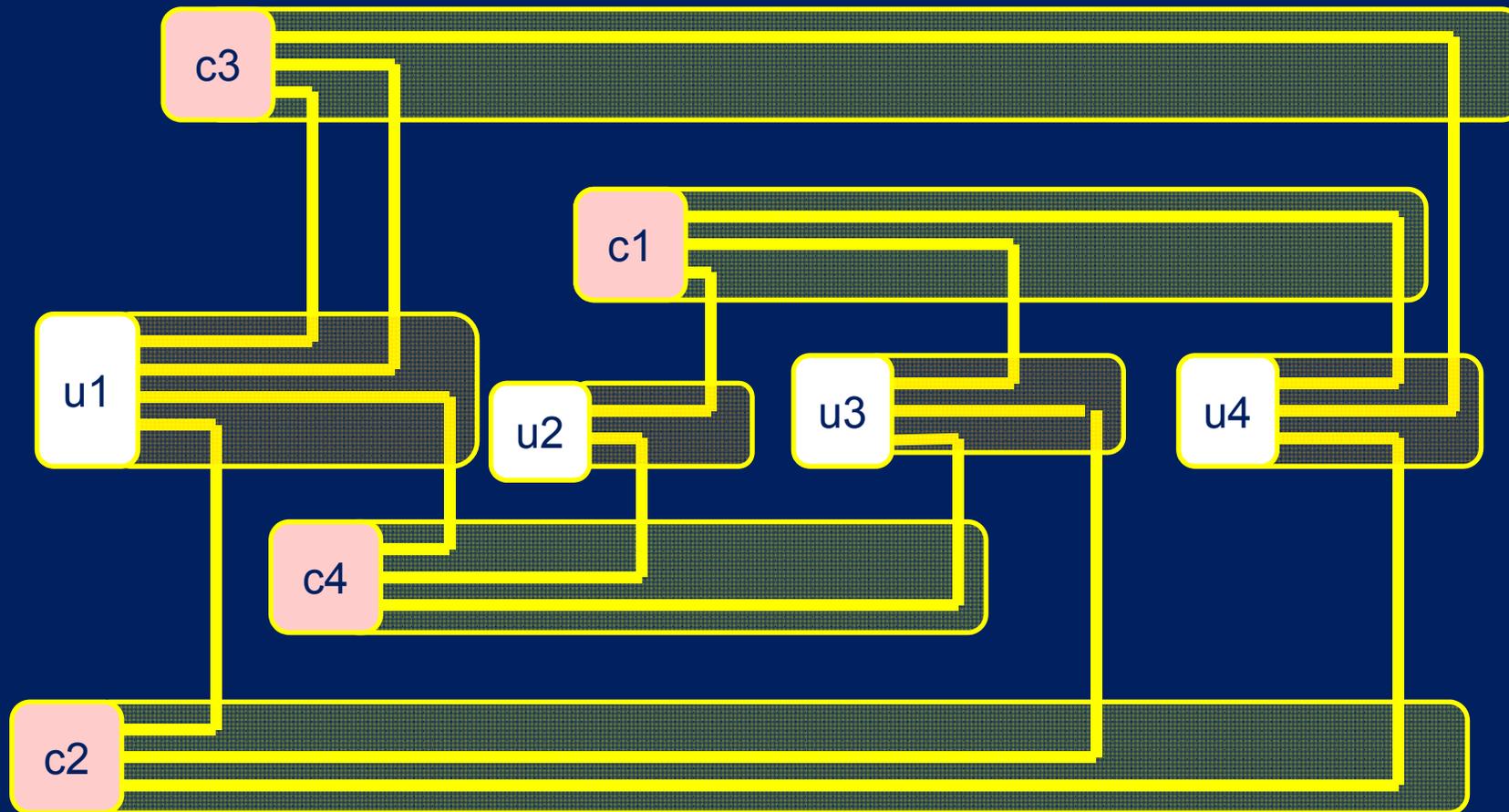
Instance  $H$  of planar 3-sat graph

1. Draw  $H$  as a visibility drawing



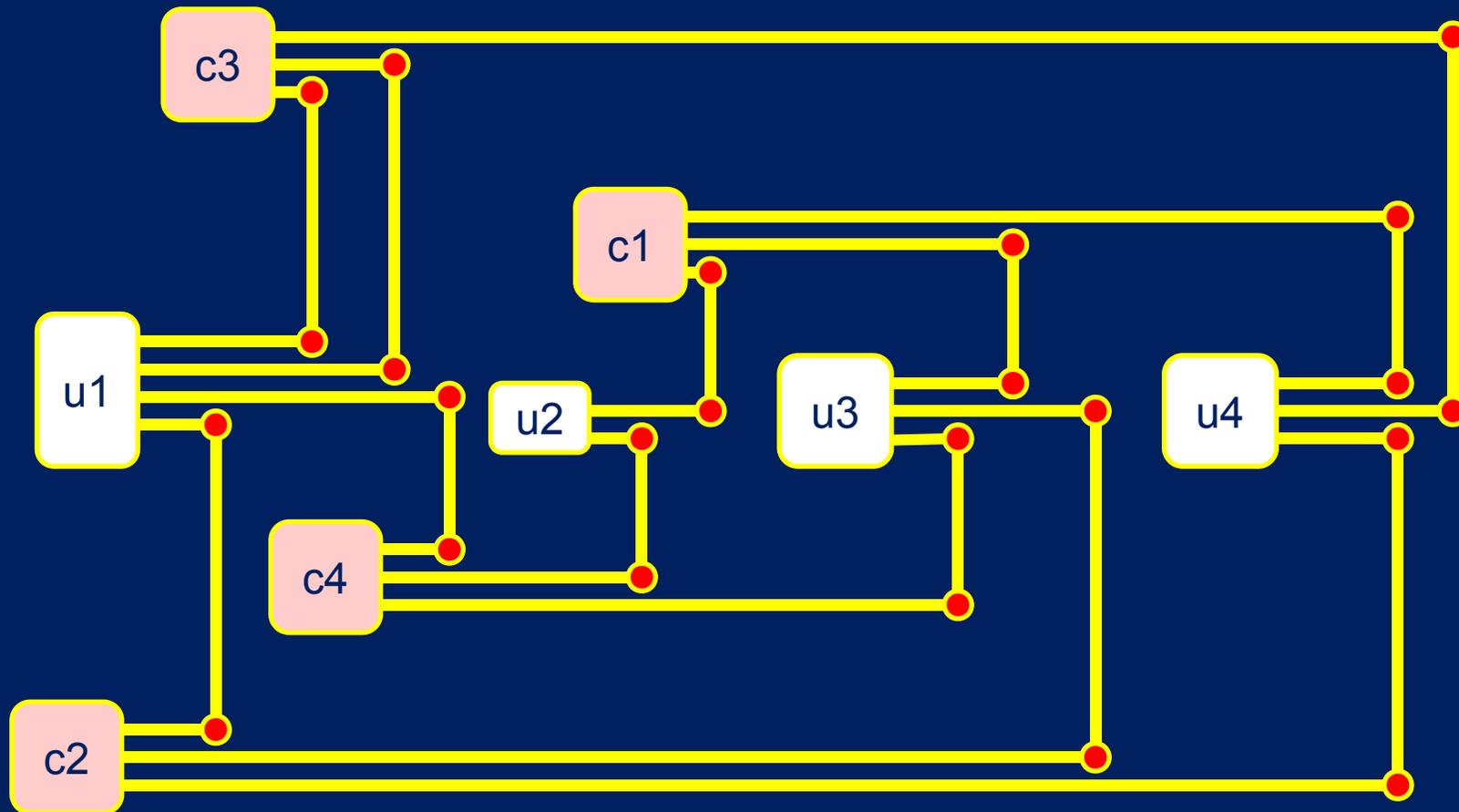
2. Enhance the drawing:

- “node boxes” for
  - clauses  $c_1, c_2, \dots$
  - variables  $u_1, u_2, \dots$

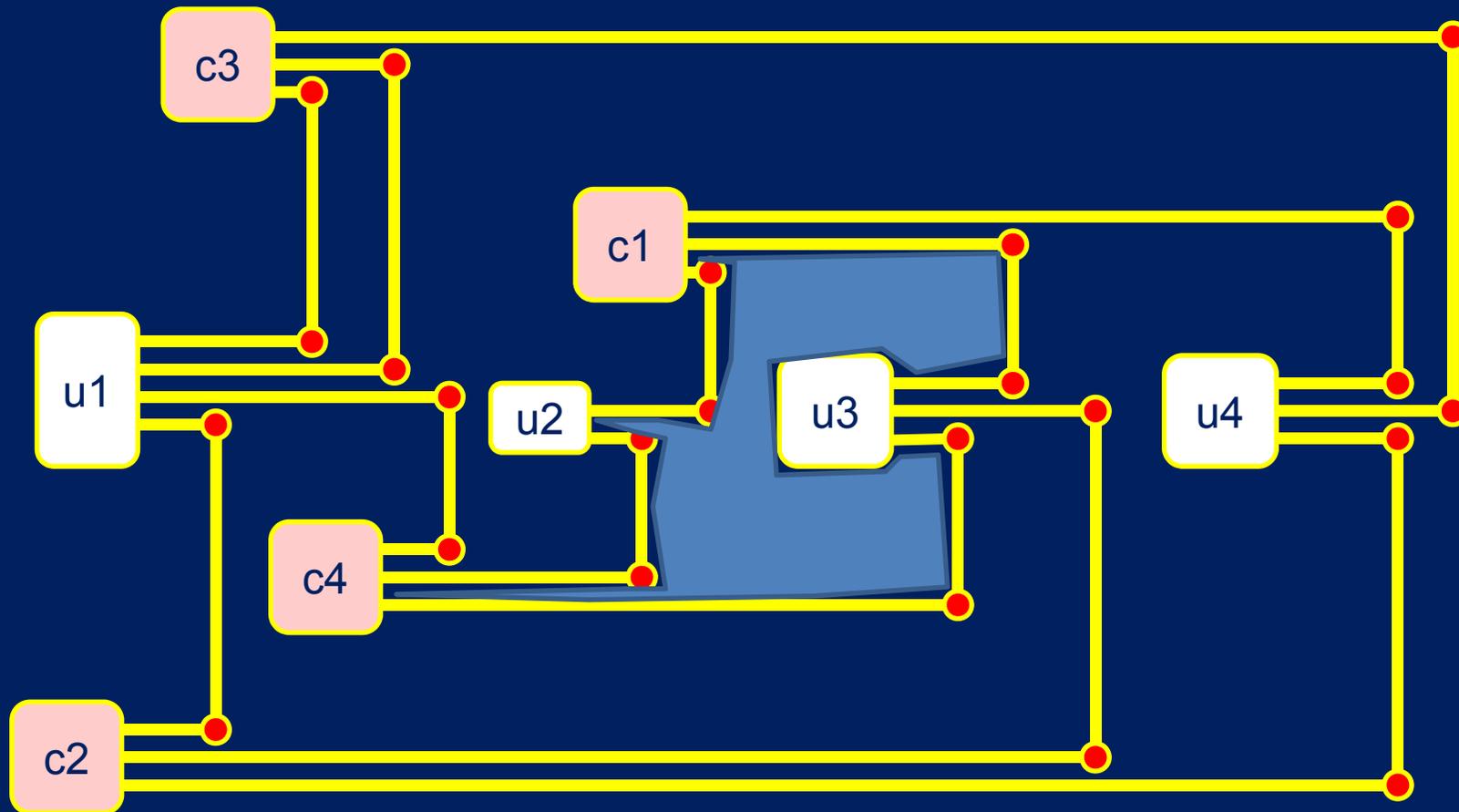


### 3. Transform to a 2-bend drawing

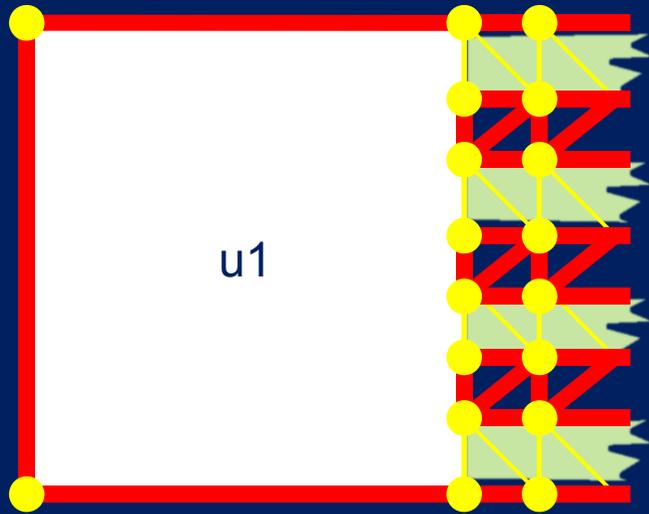
- “pipes” to communicate between variables and clauses



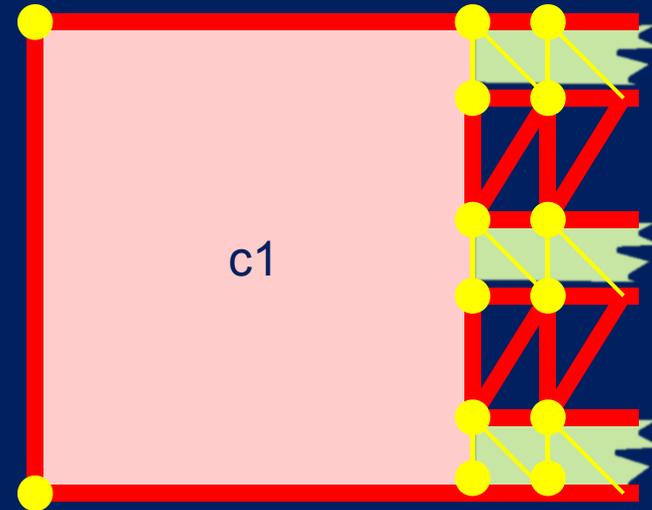
4. Transform to a no-bend drawing  
➤ extra nodes at bend points



5. Triangulate every face to make it impassable

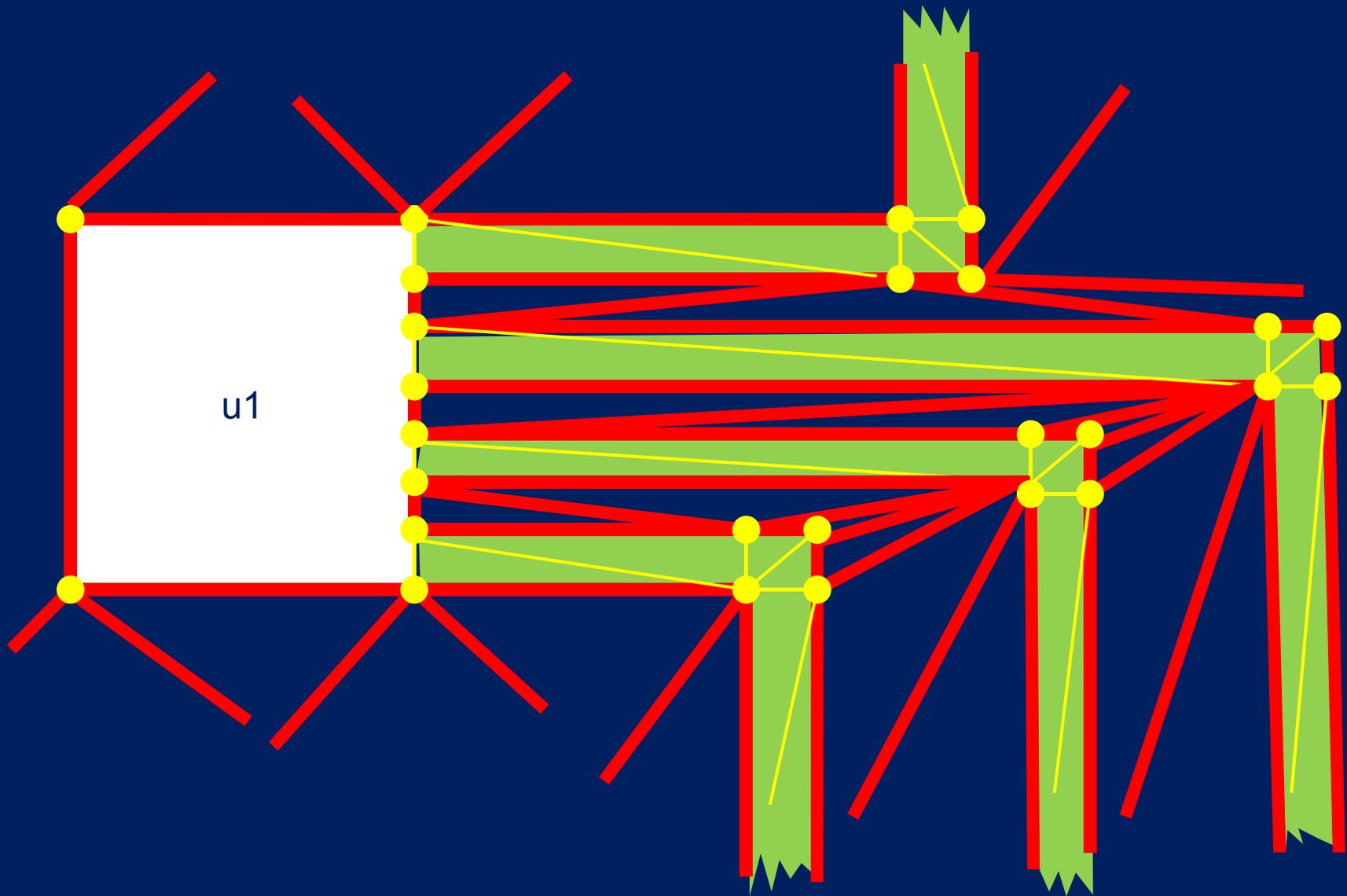


variable

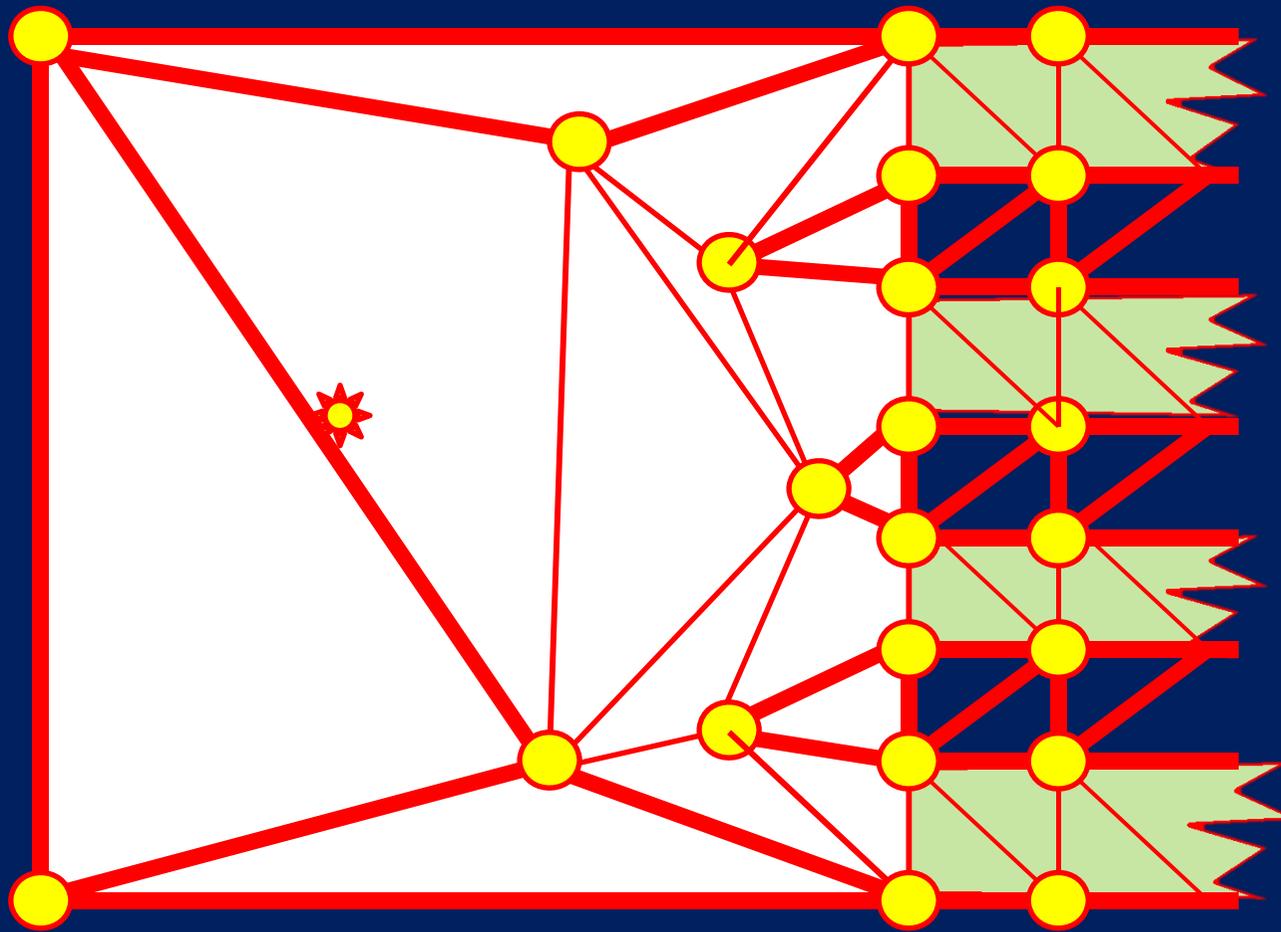


clause

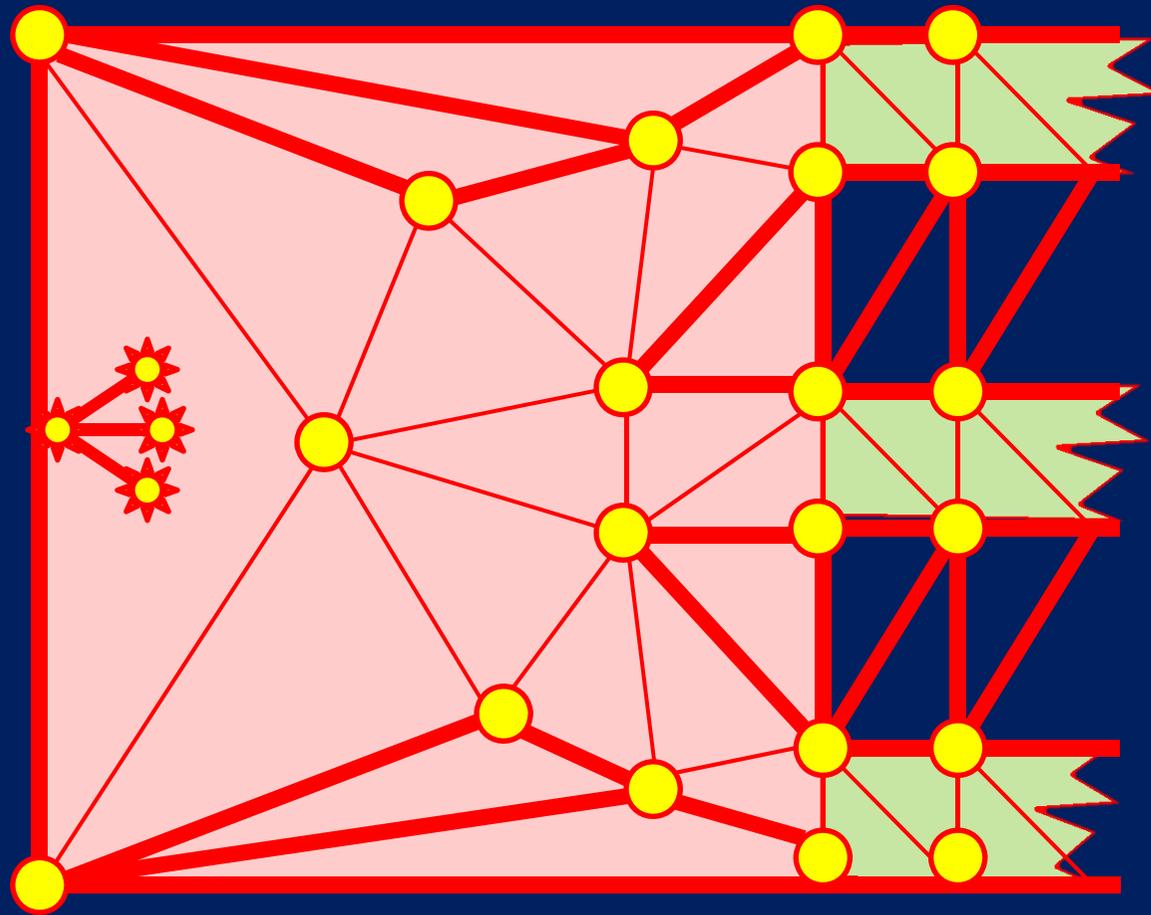
External appearance of "node boxes", with  
"pipes" attached



External appearance of "node box", with pipes attached, showing some of the external triangulation

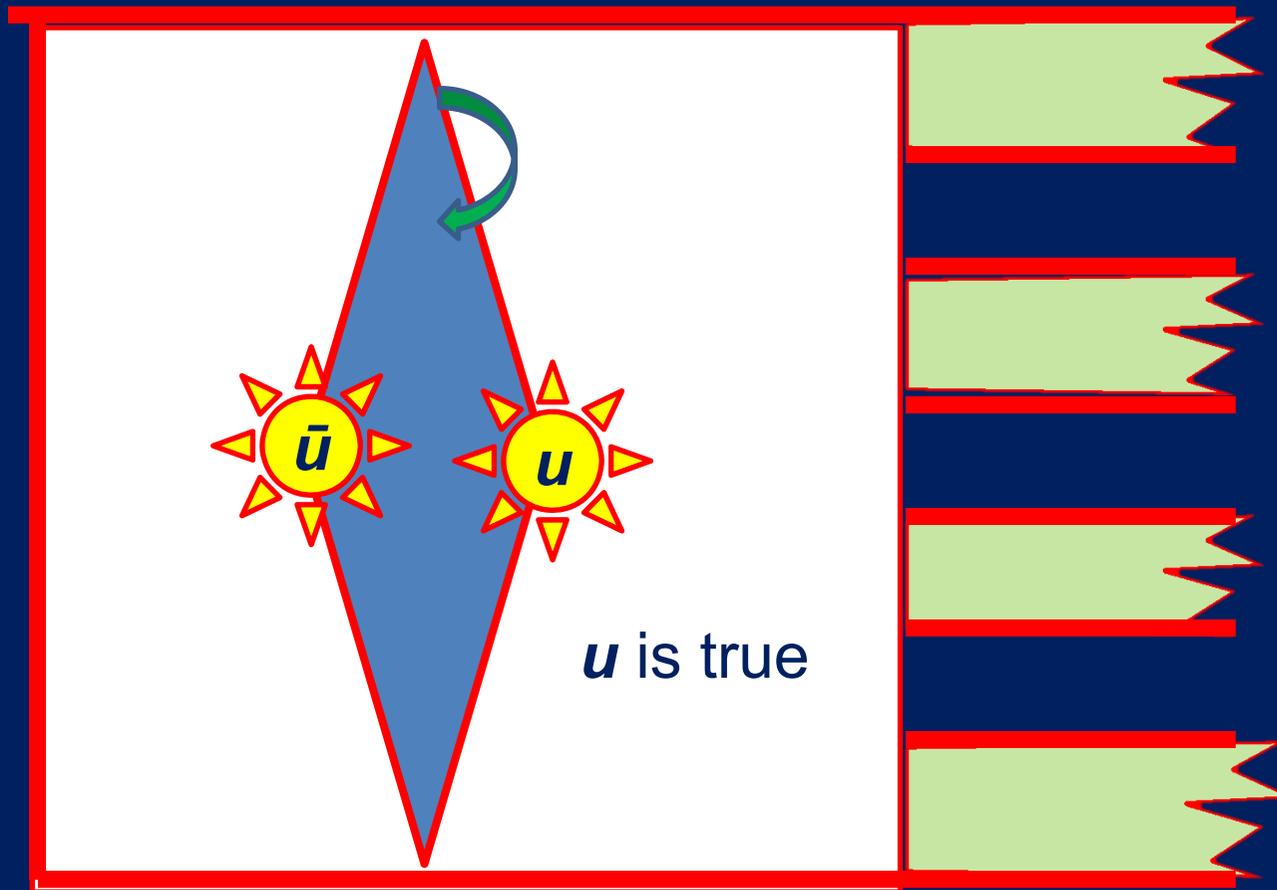


Variable gadget with pipes attached

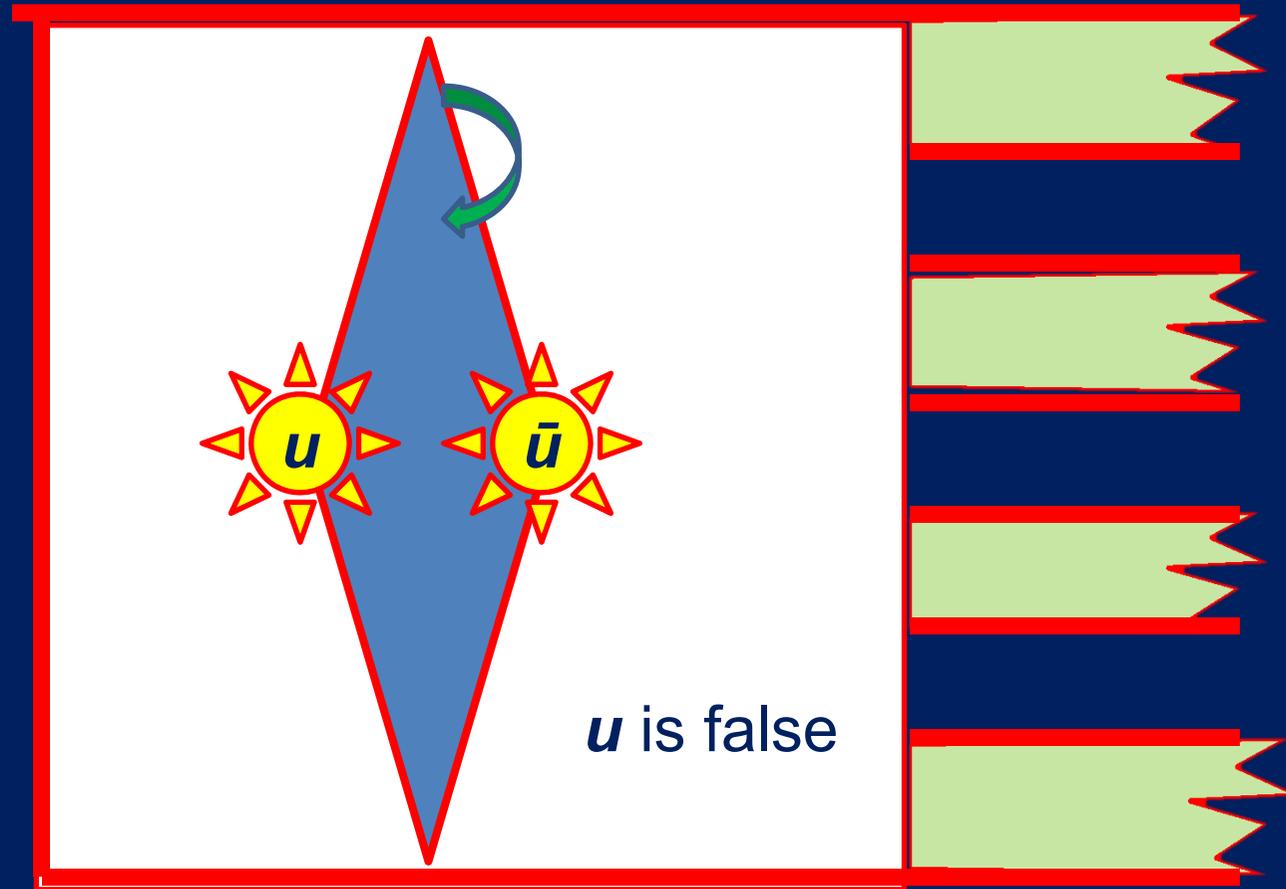


Clause gadget with pipes attached

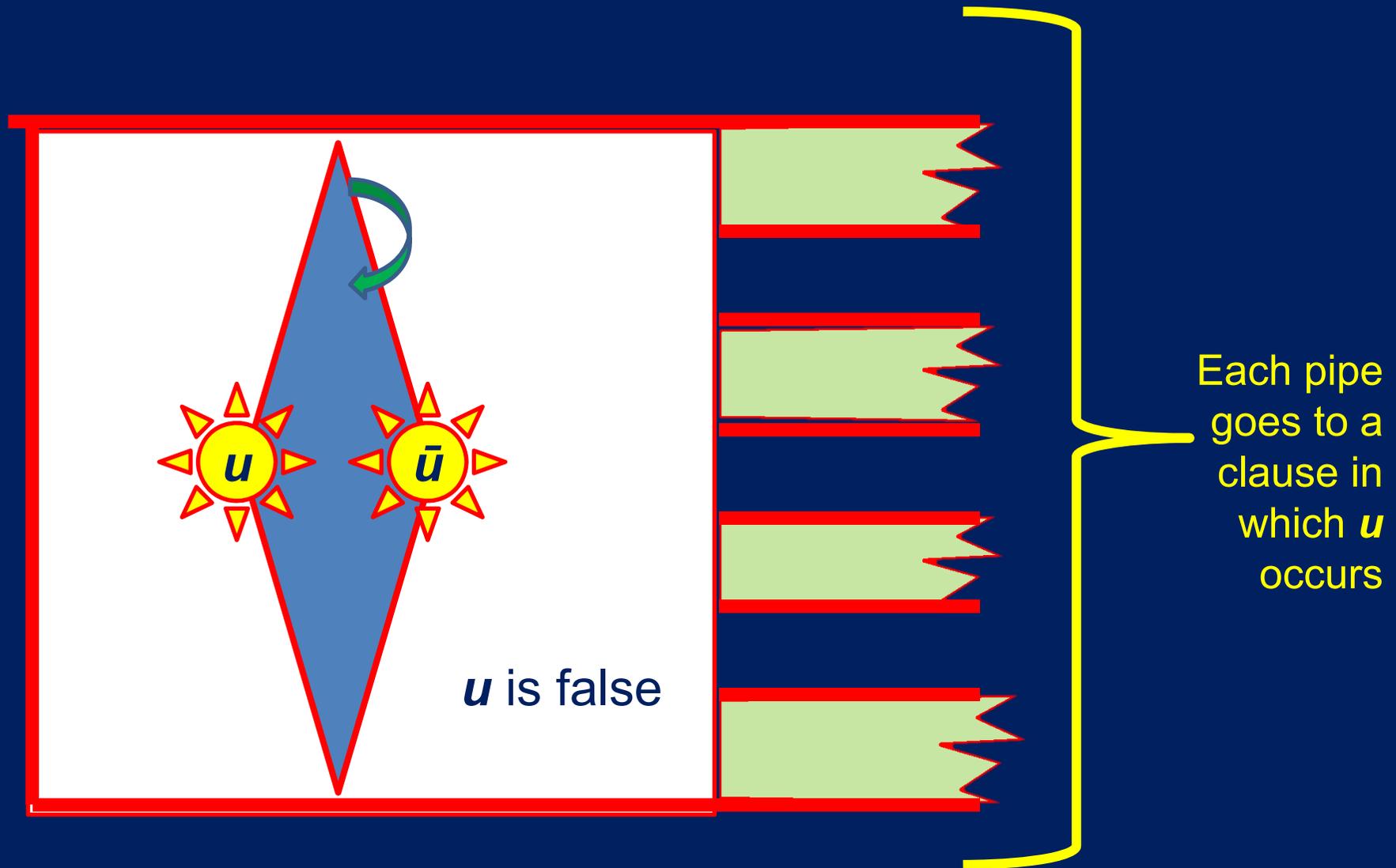
## Logical view of variable gadget



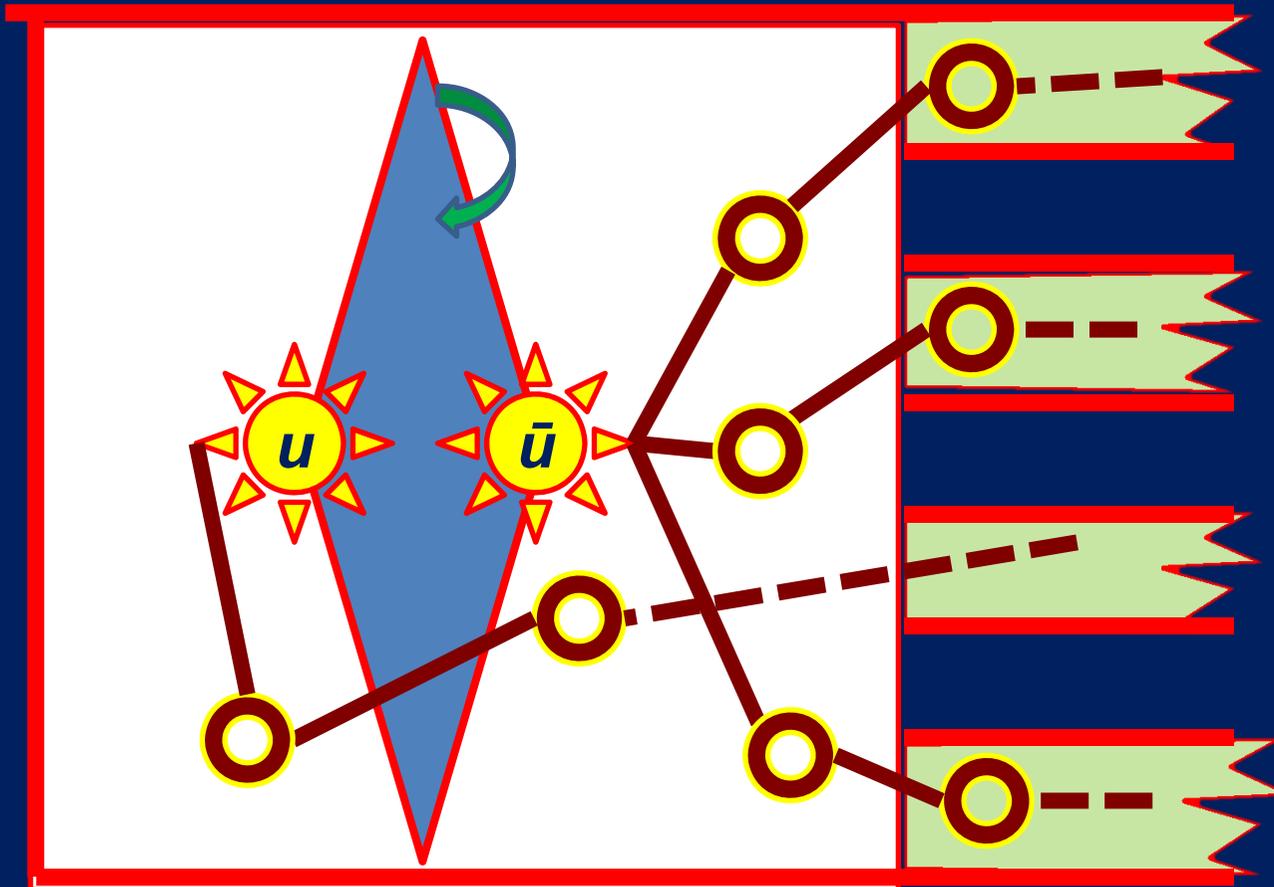
## Logical view of variable gadget



## Logical view of variable gadget

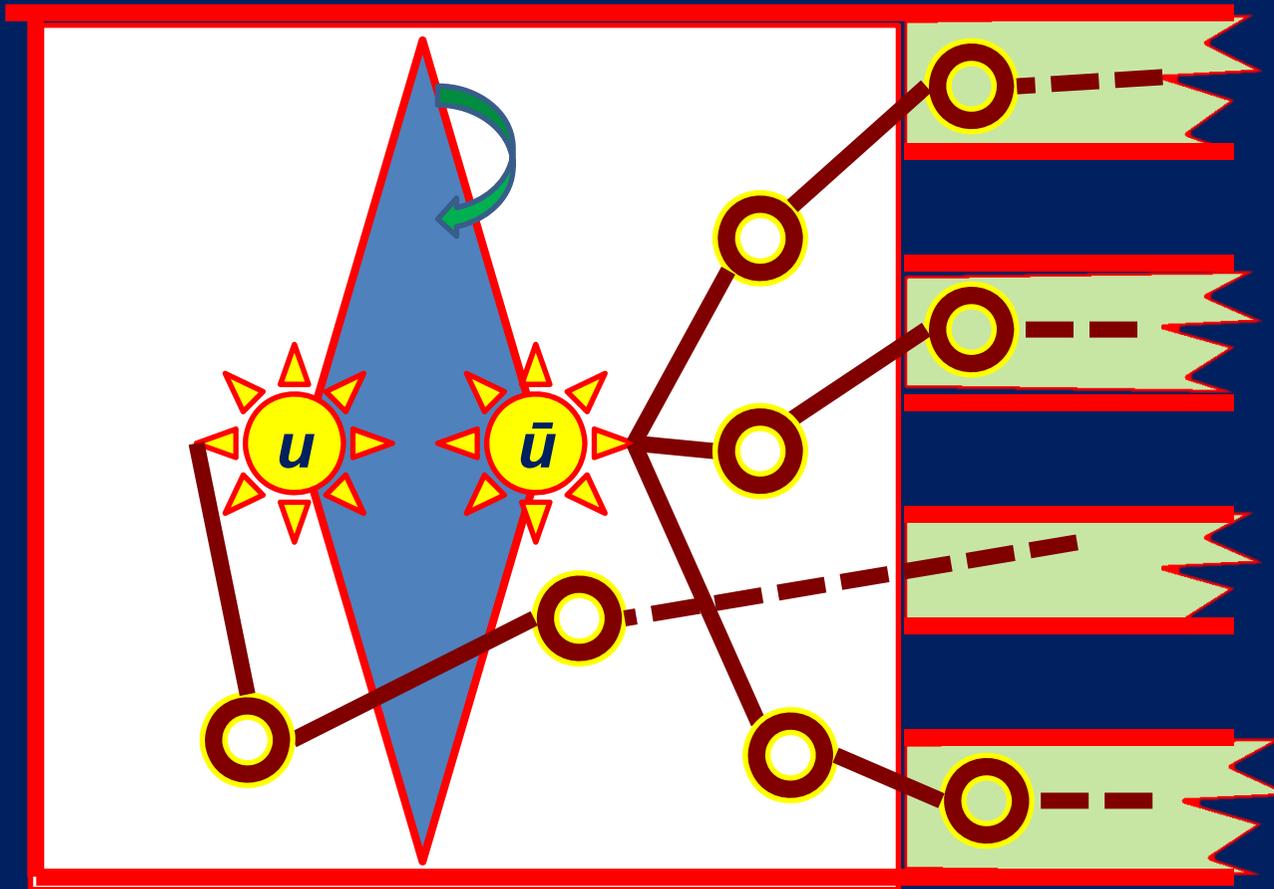


## Logical view of variable gadget



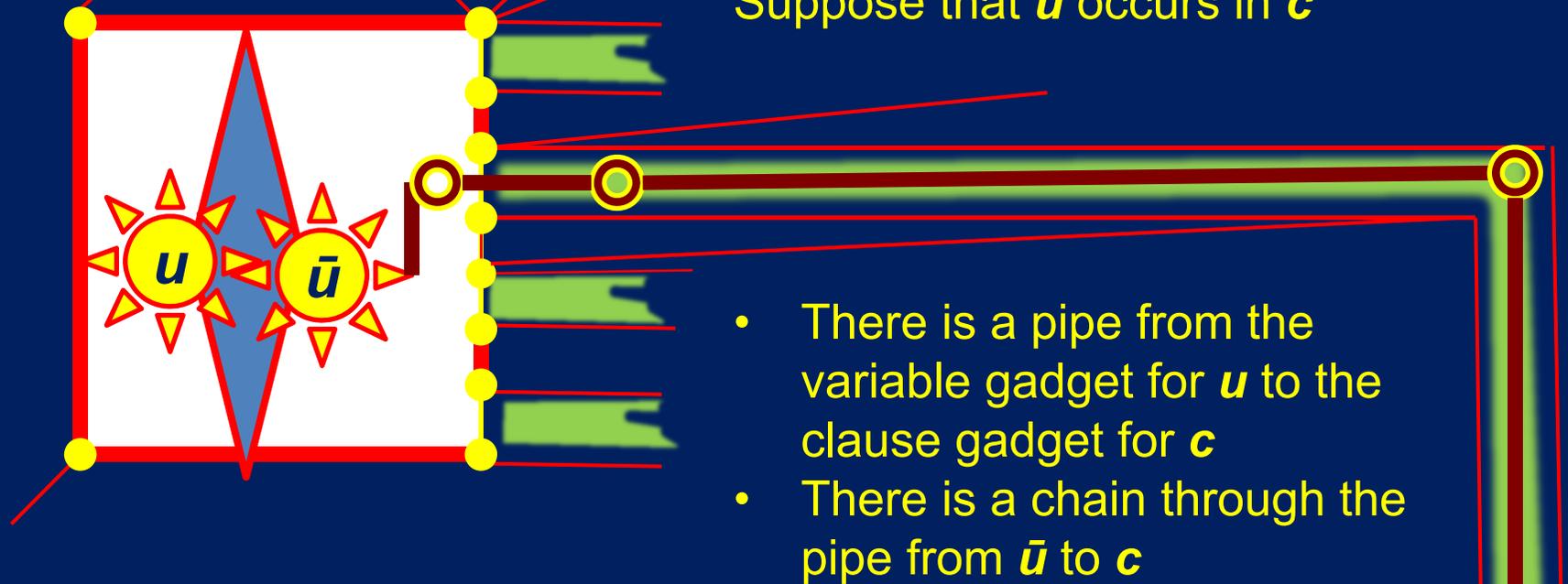
Literals are attached to the clauses in which they occur, using chains threaded through the pipes

## Logical view of variable gadget

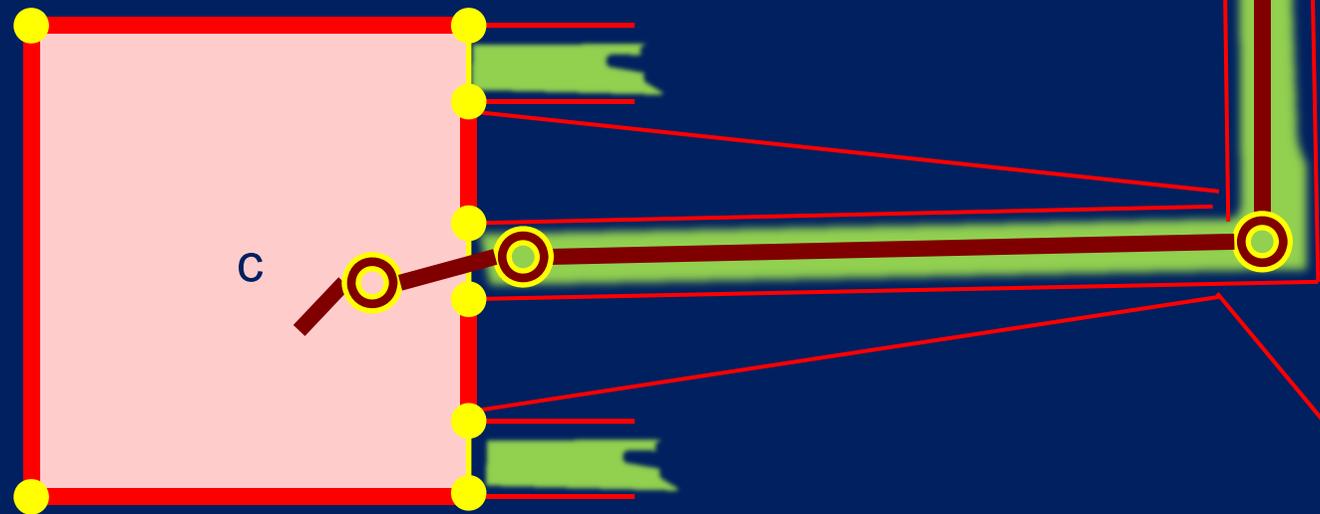


Chains attached to the rear literal spend an extra link before getting into the pipe.

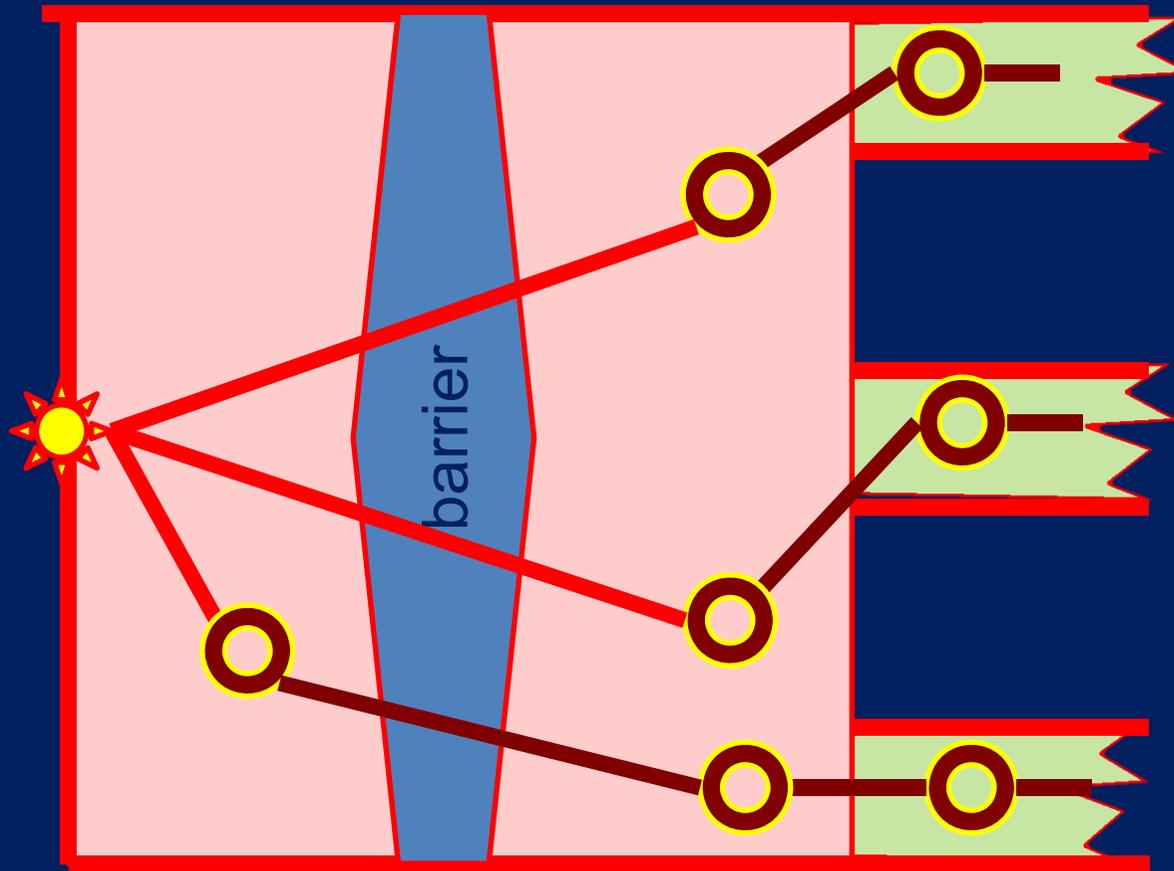
Suppose that  $\bar{u}$  occurs in  $c$



- There is a pipe from the variable gadget for  $u$  to the clause gadget for  $c$
- There is a chain through the pipe from  $\bar{u}$  to  $c$



## Logical view of clause gadget

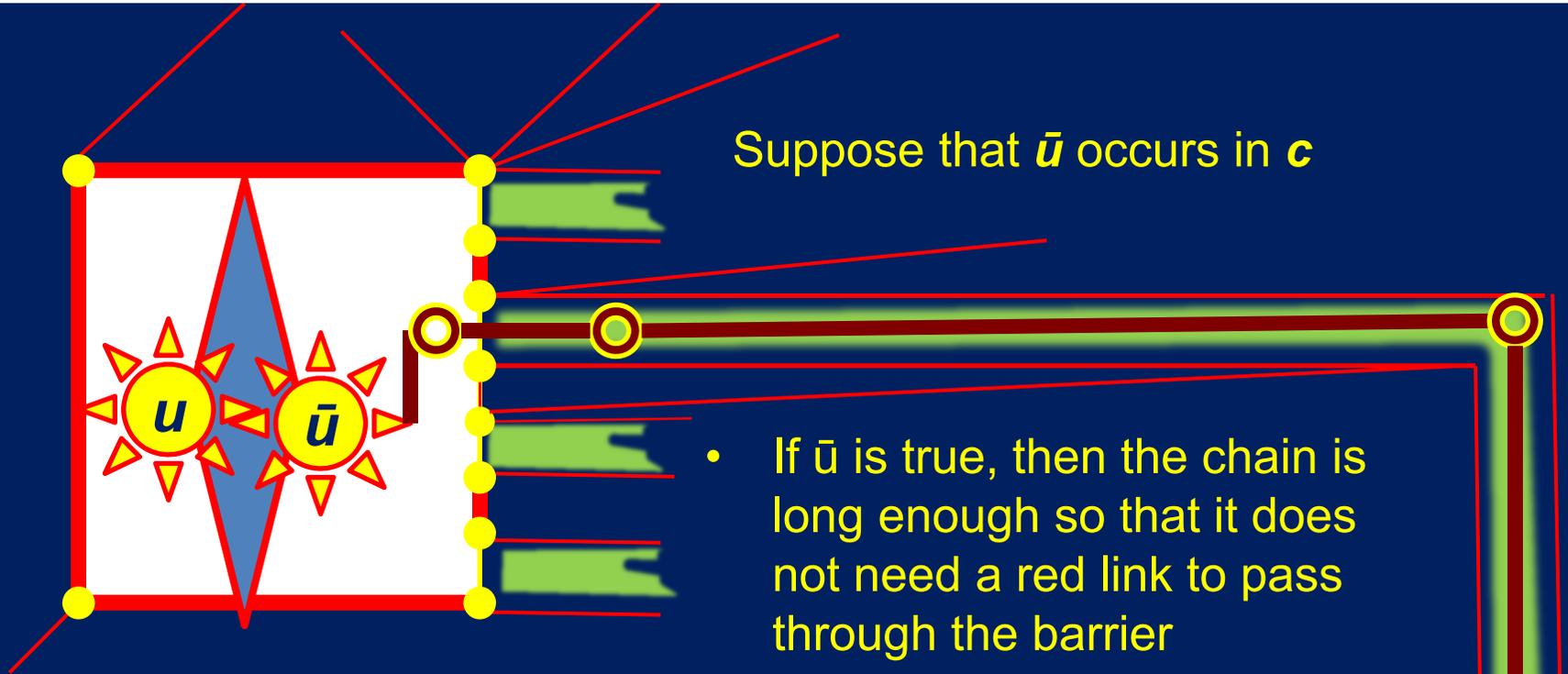


The barrier allows

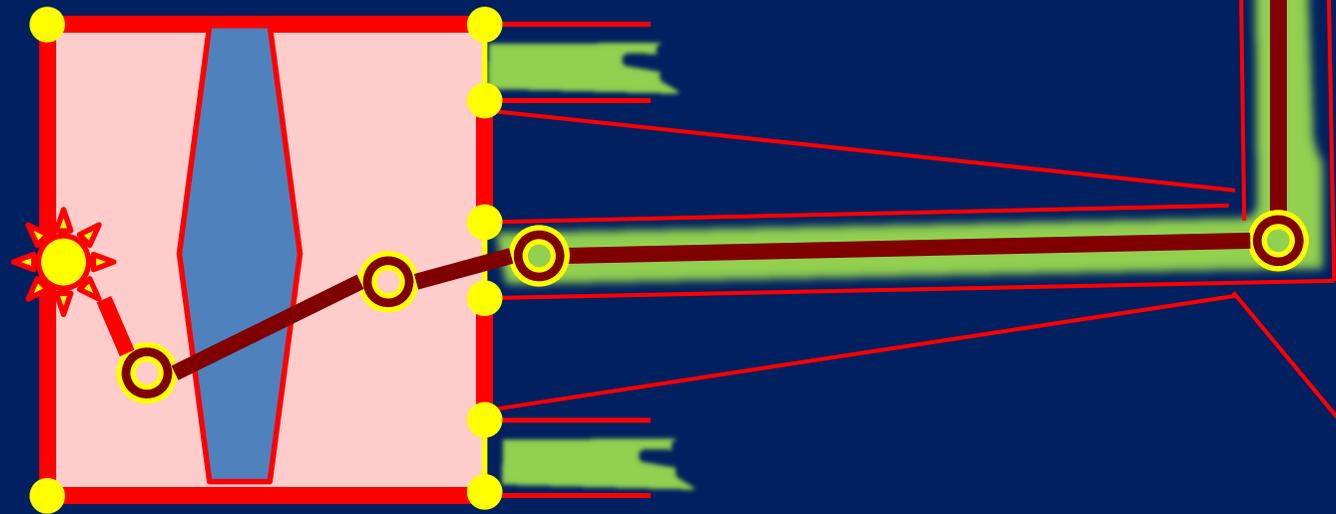
- Any number of brown links to pass through
- At most two red links to pass through

Thus at least one chain needs to be long enough to reach past the barrier

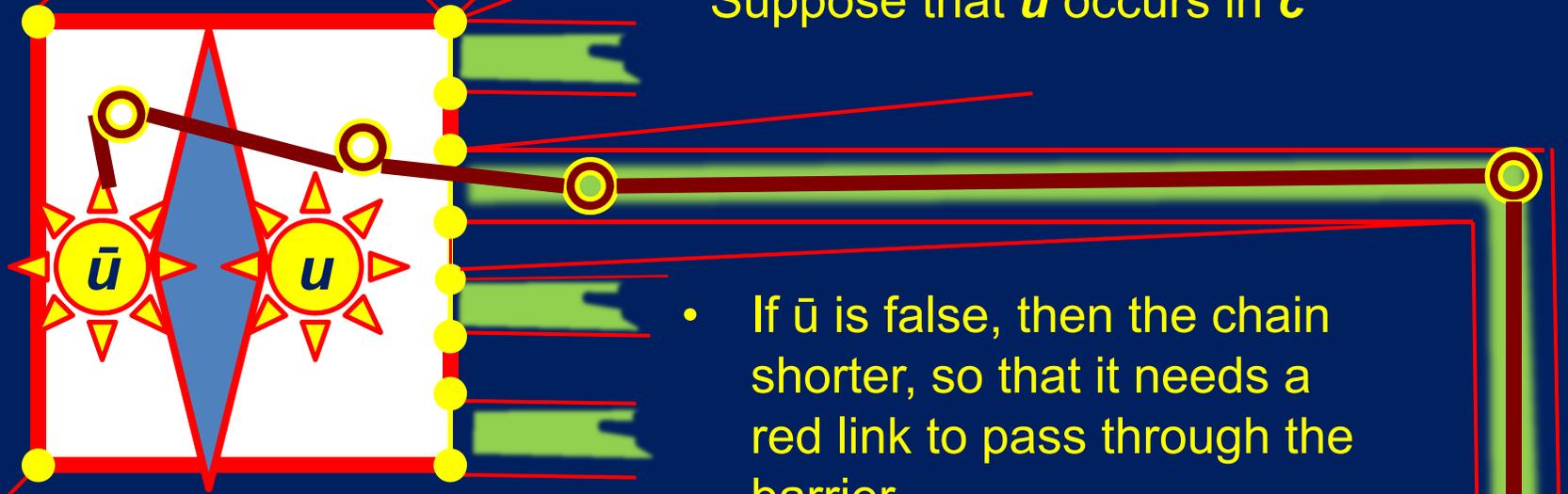
Suppose that  $\bar{u}$  occurs in  $c$



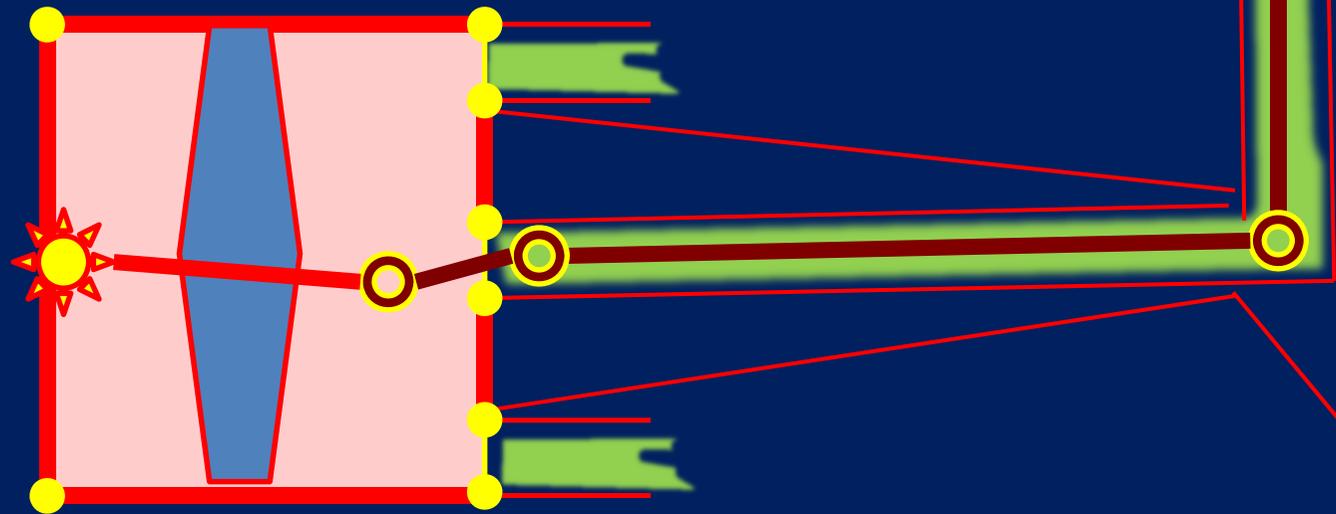
- If  $\bar{u}$  is true, then the chain is long enough so that it does not need a red link to pass through the barrier

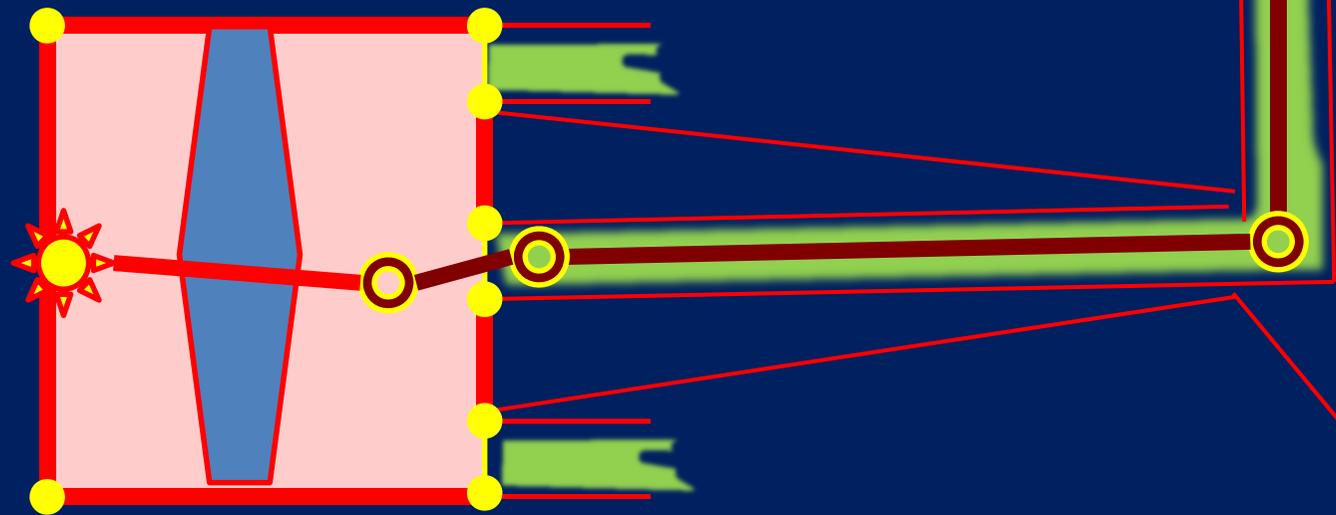
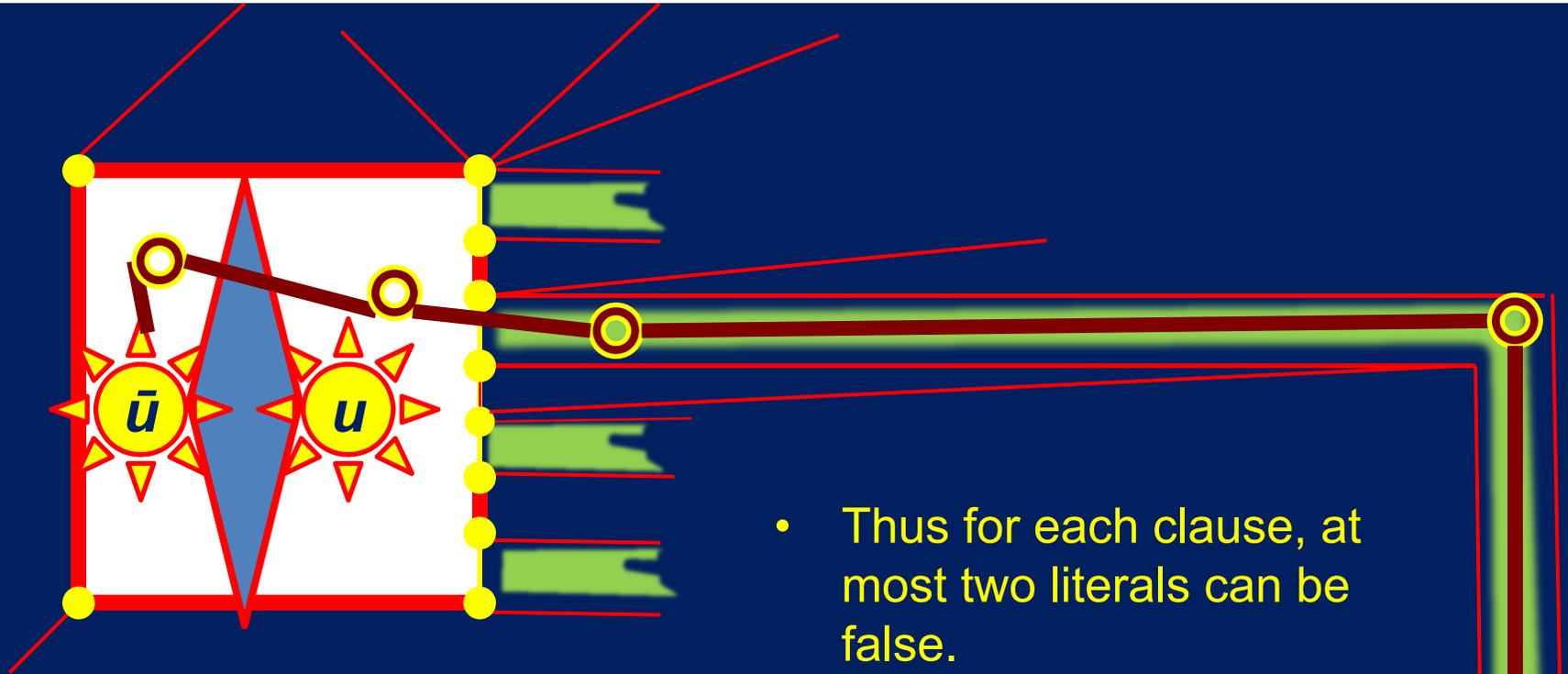


Suppose that  $\bar{u}$  occurs in  $c$



- If  $\bar{u}$  is false, then the chain shorter, so that it needs a red link to pass through the barrier





## Notes

- This is a fairly generic proof strategy for NP-hardness for layout problems.
- Details of clause and variable gadgets are straightforward but tedious
- The same proof works for 1-planar graphs: just choose different gadgets for clauses and variables.

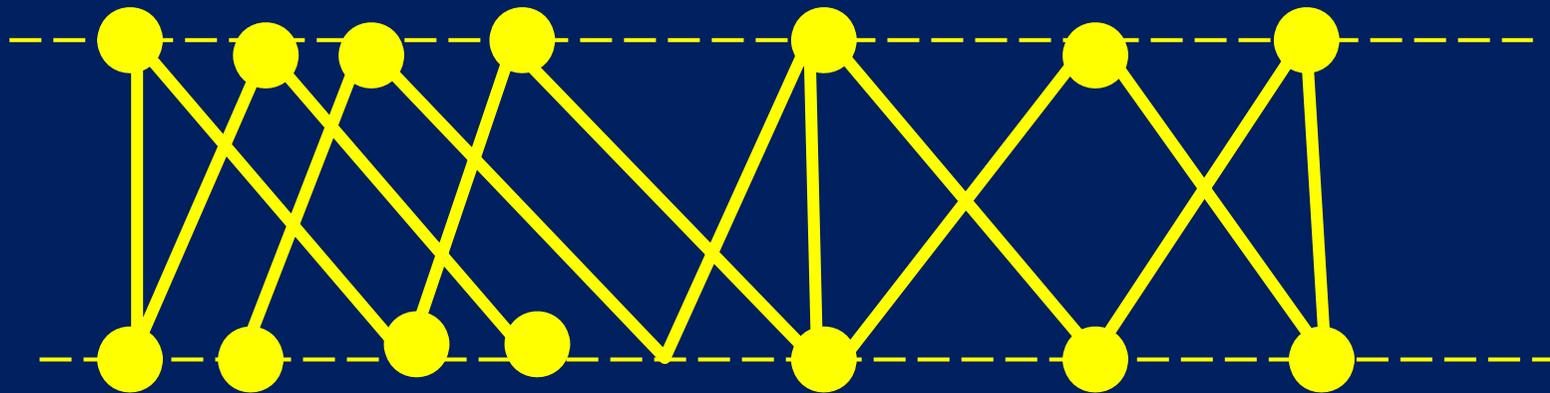
## ***What about heuristics?***

- Several force-directed methods (Huang, Nguyen, Hong, et al.) have been tested and seem to work OK to produce larger crossing angles than regular force-directed methods.
- No combinatorial heuristics known

## *What about special classes of graphs?*

*Theorem (Liotta, Didimo, di Giacomo, Eades)*

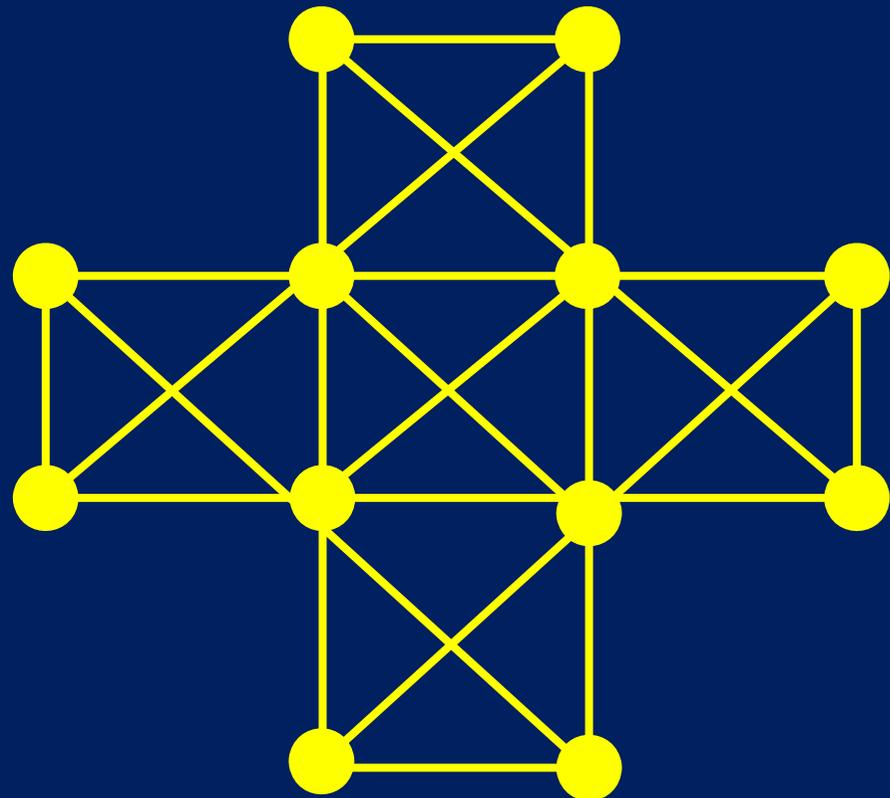
*There is a linear time algorithm to test and draw graphs  
restricted to two layers with right-angle crossings.*



## *What about special classes of graphs?*

### *Theorem (Reisi)*

*There is a linear time algorithm to test and draw outer-1-planar graphs with right-angle crossings.*



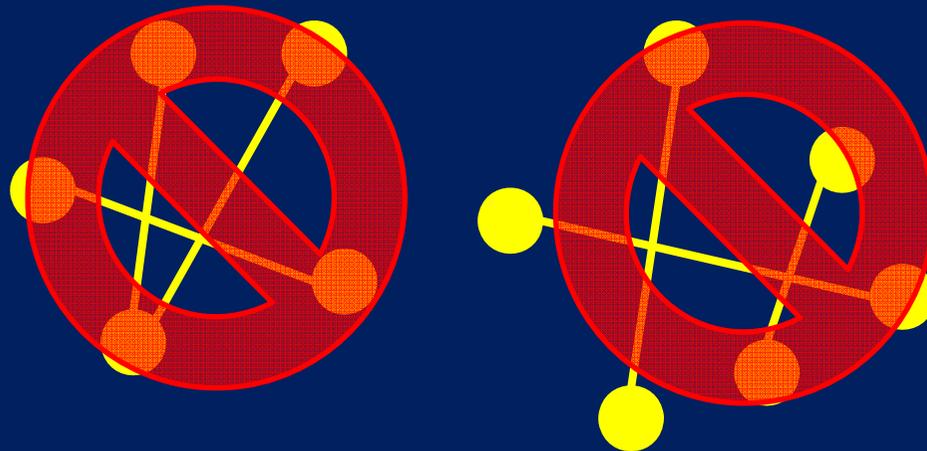
However:

- the problem of drawing graphs with large crossing angles remains mostly open, both from both practical and theoretical points of view.

## More slightly-non-planar graphs

### 1-planar:

- No edge has more than one crossing



## Questions for 1-planar graphs:

- How dense can a 1-planar graph be?

$4n-8$  (Ackerman-Tardos)

- How can you compute the topology of 1-planar graph?

*NP-hard* (Korzhik-Mohar)

- *Given the topology, how can you compute a drawing of a 1-planar graph?*

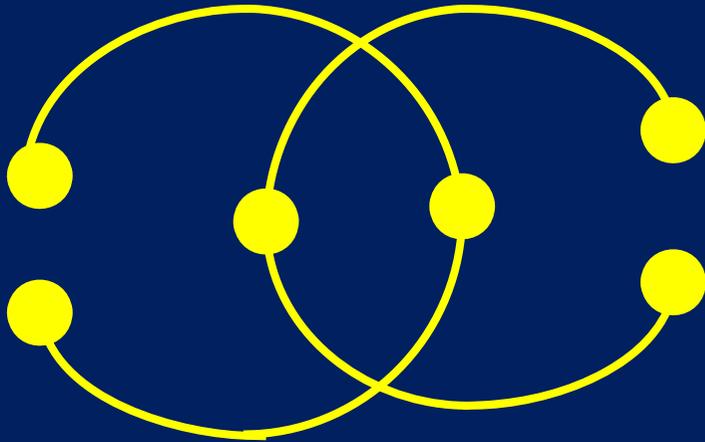
*Recent algorithm  
(Hong-Eades-Liotta-Poon)*

- *What is the relationship between 1-planar graphs and RAC graphs?*

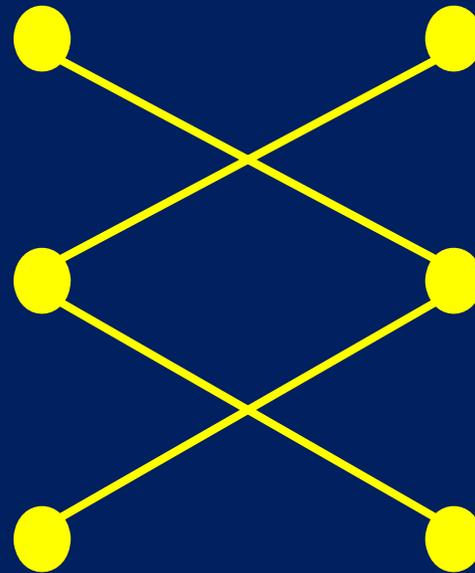
*Recent theorem  
(Eades-Liotta)*

Some 1-planar graphs have a 1-planar straight-line drawing,  
others have no 1-planar straight-line drawing.

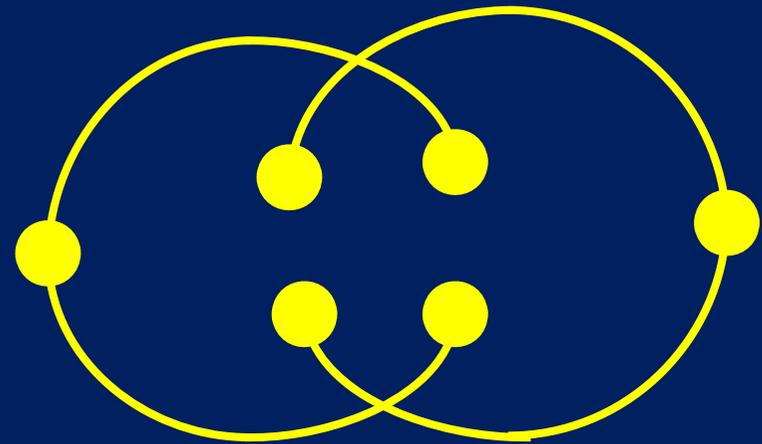
## Chanel graph



The chanel graph has a  
straight-line drawing



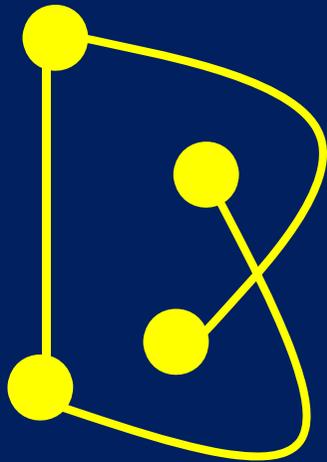
## Gucci graph



Lemma:

The gucci graph has no  
straight-line drawing

## Bulgari graph

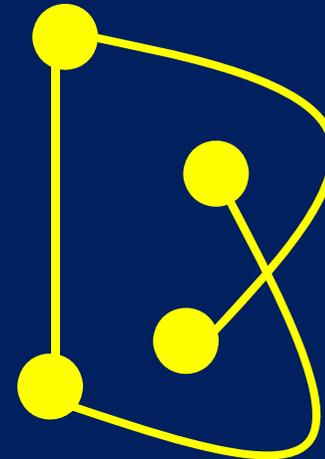
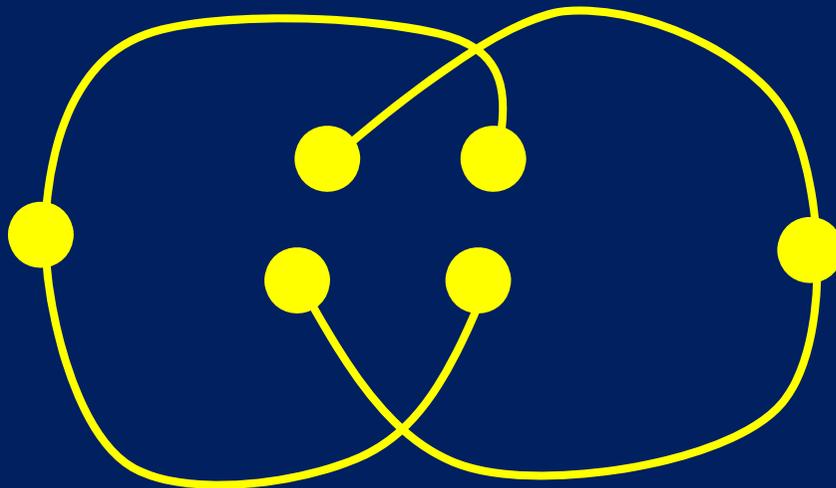


Lemma:

The bulgari graph has no  
straight-line drawing

Theorem (Hong, Liotta, Poon, Eades, 2011)

Suppose that  $G$  is a 1-planar topological embedding. Then  $G$  has a straight-line drawing if and only if  $G$  has no gucci subgraph and no bulgari subgraph.

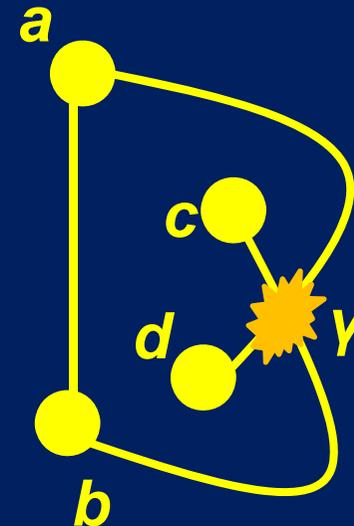


Theorem (Hong, Liotta, Poon, Eades, 2011)

Suppose that  $G$  is a 1-planar topological embedding. Then  $G$  has a straight-line drawing if and only if  $G$  has no gucci subgraph and no bulgari subgraph.

### Proof

- Necessity for bulgari graph:
  - Angles in the triangle  $aby$  add up to  $\pi$
  - Thus 3 angles at  $y$  add up to strictly less than  $\pi$
  - This is impossible if  $ad$  and  $bc$  are straight lines.
- Similar argument for the gucci graph



Theorem (Hong, Liotta, Poon, Eades, 2011)

Suppose that  $G$  is a 1-planar topological embedding. Then  $G$  has a straight-line drawing if and only if  $G$  has no gucci subgraph and no bulgari subgraph.

Proof

- Sufficiency

- Much more complicated
- Provides an algorithm:

Input: a 1-planar topological embedding  $G$  with no gucci subgraph and no bulgari subgraph.

Output: a straight line drawing of  $G$

## Algorithm for Straight-line 1-planar graph drawing

Input: a 1-planar topological embedding  $G$

Output: a straight line drawing of  $G$ , if it exists

1. Testing: Test whether  $G$  has a gucci subgraph or a bulgari subgraph.
2. Augmentation: Add non-crossing edges to make an augmented graph  $G^+$ , with higher connectivity.
3. Drawing: Apply a convex drawing algorithm together with an SPQR trees to  $G^+$ .

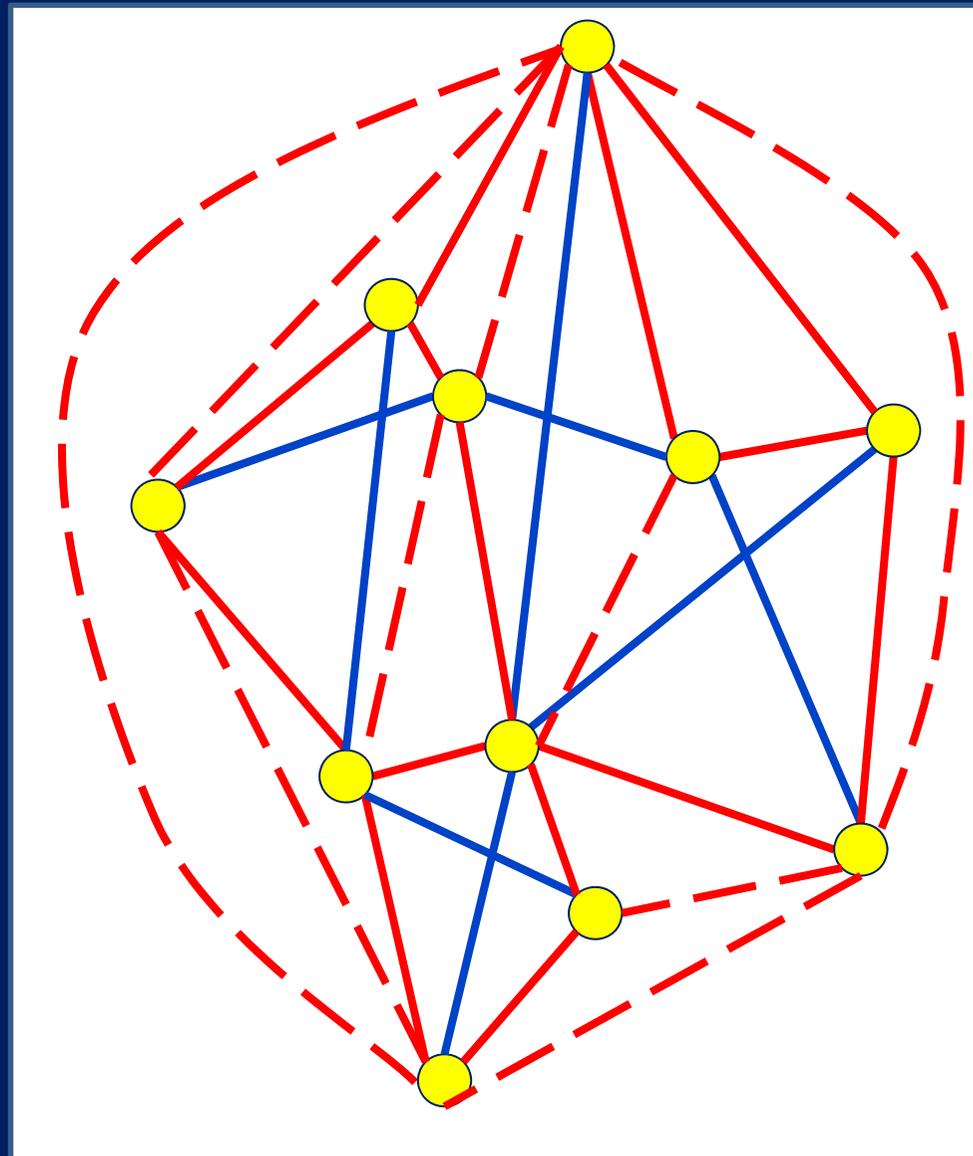
1. Testing: Test whether  $G$  has a gucci subgraph and no bulgari subgraph.
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3. Drawing: Use a convex drawing algorithm together with an SPQR trees to  $G^+$ .

## Red and blue edges

- Red edges: no crossings
- Blue edges: 1 crossing

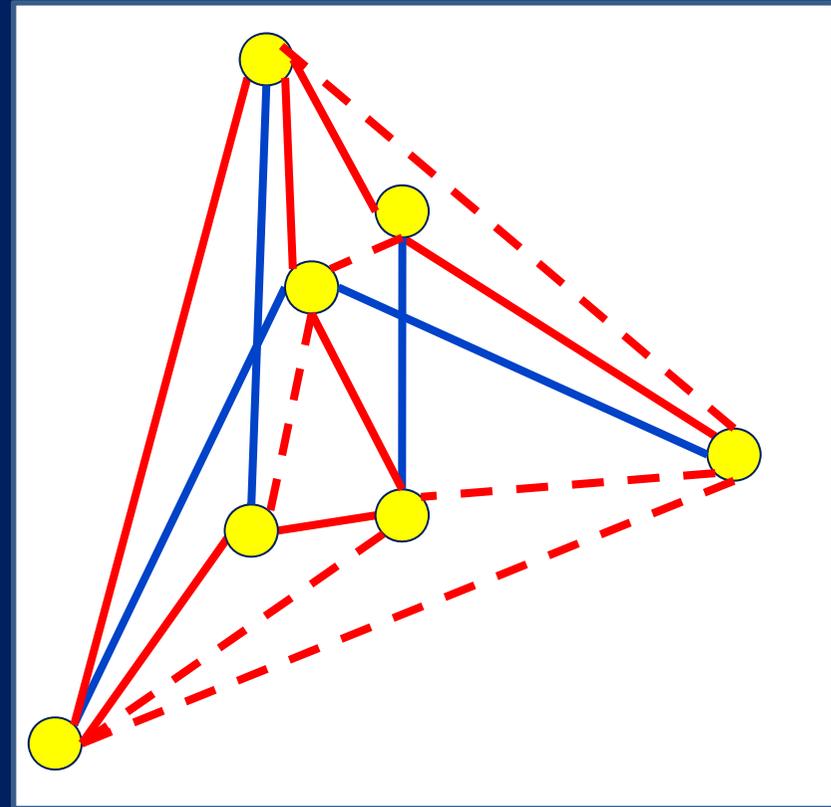
### Red-maximal:

- A graph is red-maximal if adding an edge causes a crossing
- ie, a graph is red-maximal if whenever a pair  $a, b$  of vertices share a face, then  $(a,b)$  is an edge.



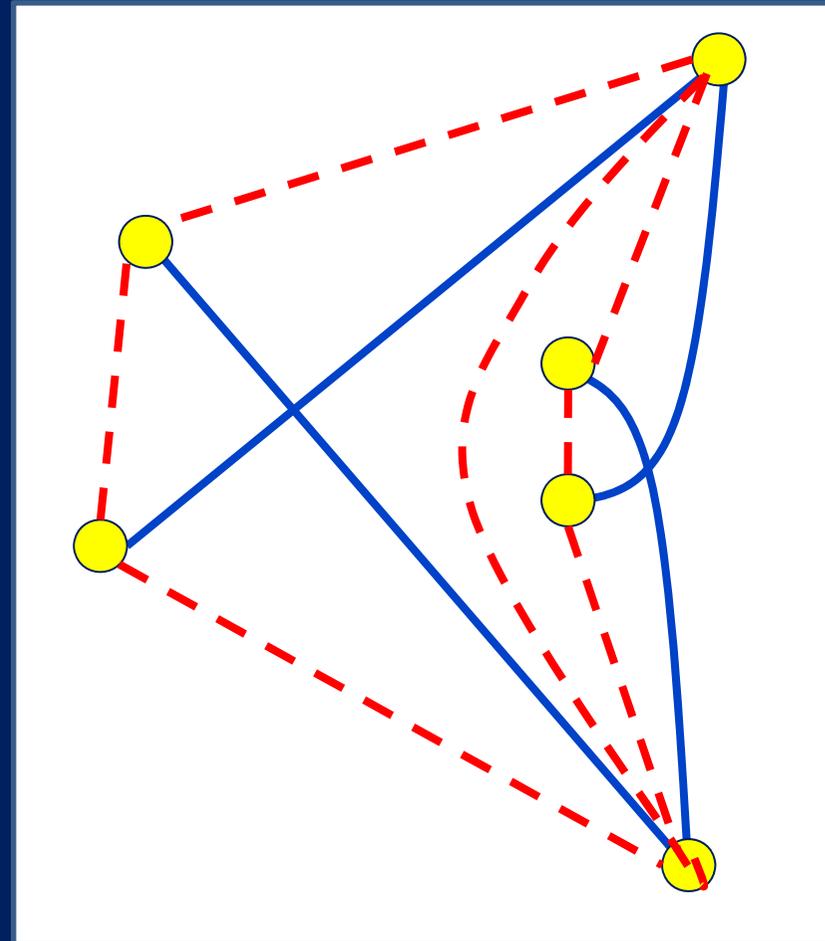
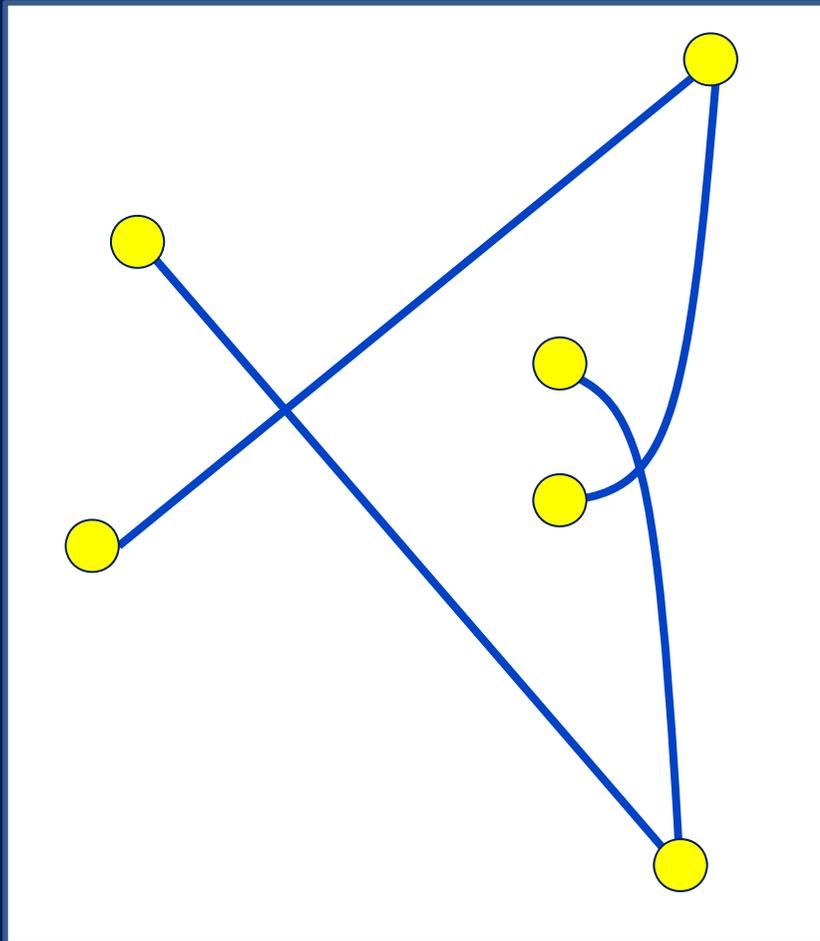
Naive augmentation algorithm  
to obtain red-maximality:

*For each nonadjacent pair  
 $a, b$  of vertices that share  
a face, add the edge  
 $(a, b)$*



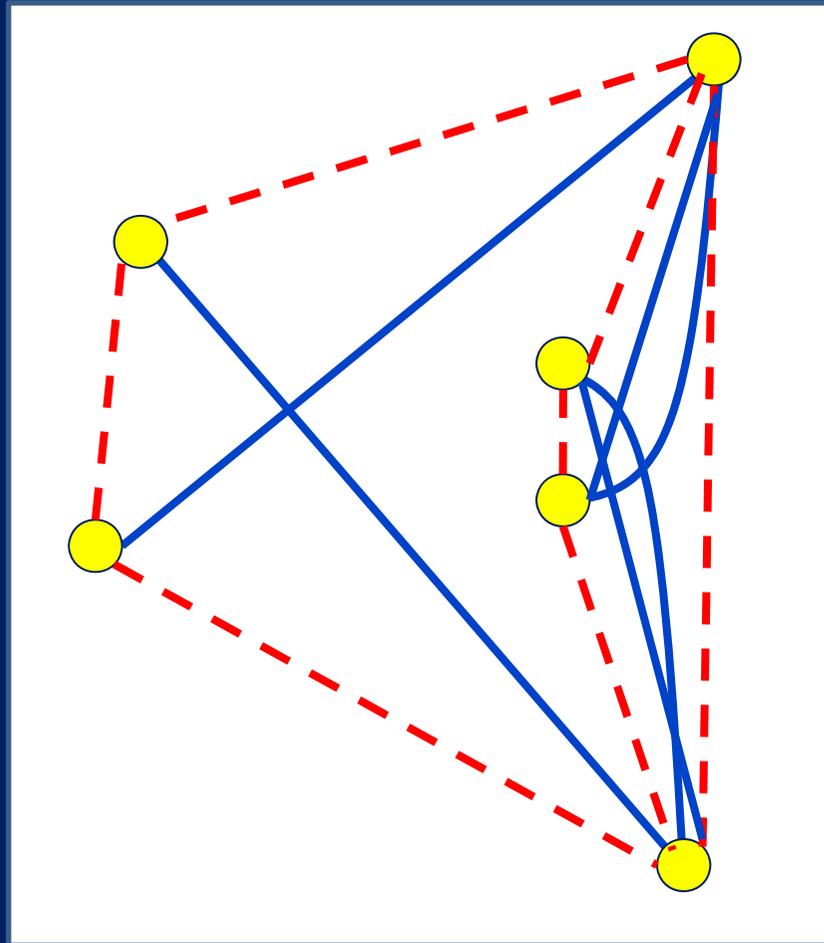
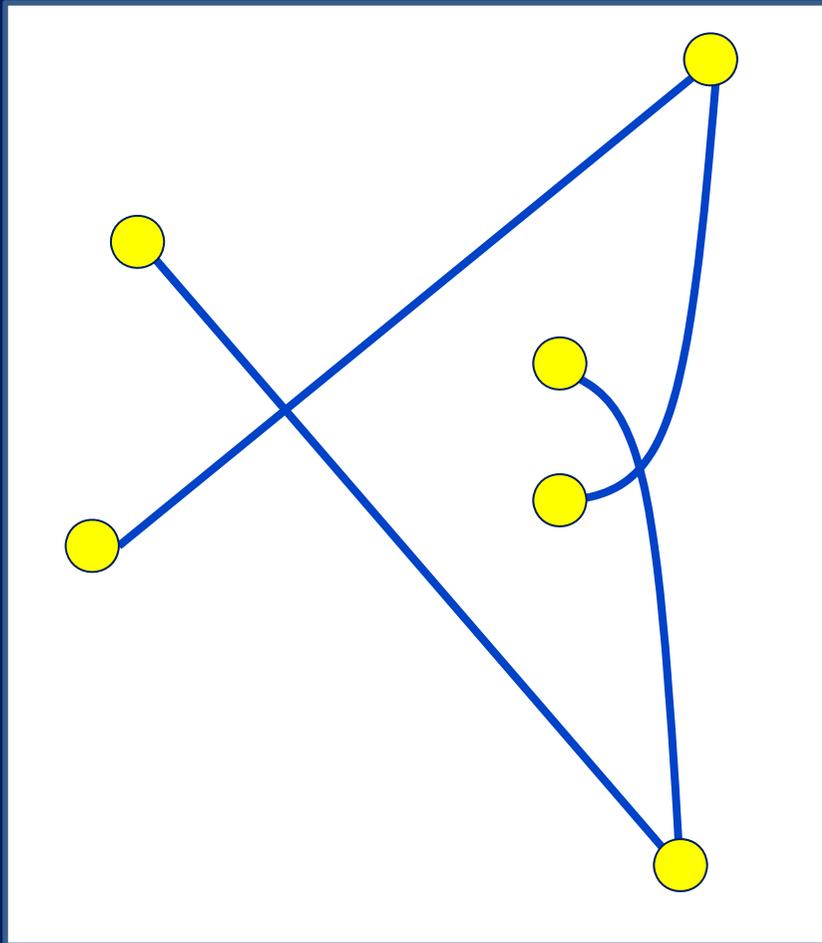
➤ But: the naive algorithm does not work ... ..

Some augmentations may not be correct



Augmentation 1: introduces a bulgari subgraph

Some augmentations may not be correct



Augmentation 2: no bulgari subgraph

1. Testing: Test whether  $G$  has a gucci subgraph and no bulgari subgraph.
2. Augmentation: Add non-crossing edges to make an augmented graph  $G^+$ , with higher connectivity.
3. Drawing: Use a convex drawing algorithm together with an SPQR trees to  $G^+$ .

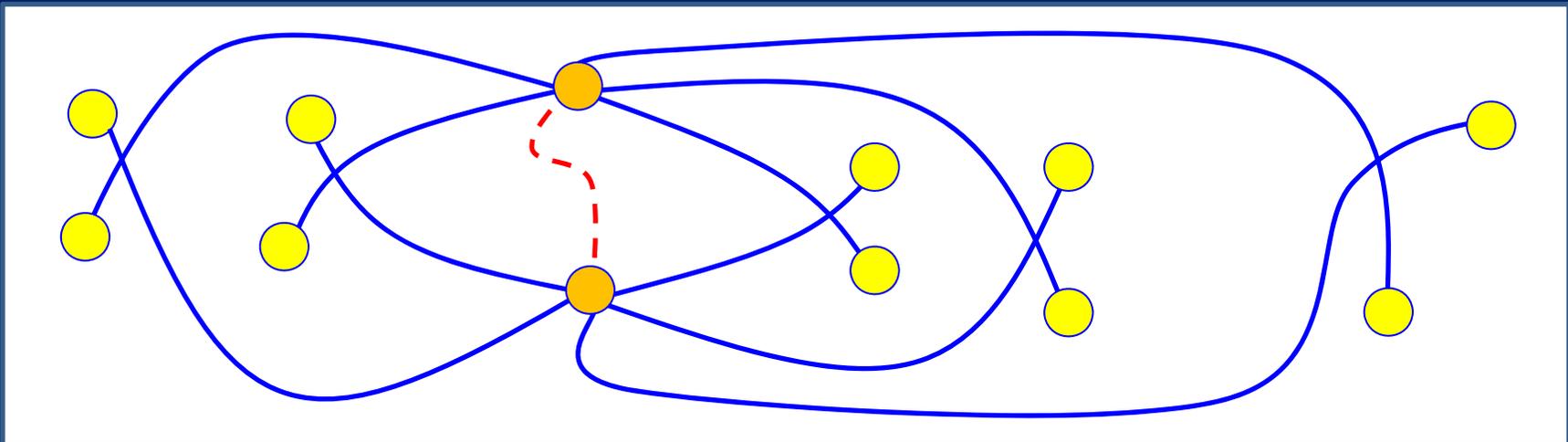
Problem:

- Naive algorithm does not work.
- Red-maximal supergraph is not unique
  - We need to choose a red-maximal supergraph with no bulgari/gucci subgraphs

1. Testing: Test whether  $G$  has a gucci subgraph and no bulgari subgraph.
2. Augmentation: Add non-crossing edges to make an augmented graph  $G^+$ , with higher connectivity.
3. Drawing: Use a convex drawing algorithm together with an SPQR trees to  $G^+$ .

### Augmentation algorithm

- Augmentation can be done an edge at a time, but when two crossings share two endpoints, we must be carefully order the edge insertions.
- Can be done in linear time.



1. Testing: Test whether  $G$  has a gucci subgraph and no bulgari subgraph.
2. Augmentation: Add non-crossing edges to make an augmented graph  $G^+$ , with higher connectivity.
3. Drawing: Use a convex drawing algorithm together with an SPQR trees to  $G^+$ .

#### Drawing Algorithm

If the red subgraph  $R$  of  $G^+$  is triconnected

Then

- Draw  $R$  using a convex drawing algorithm
- Insert crossing edges

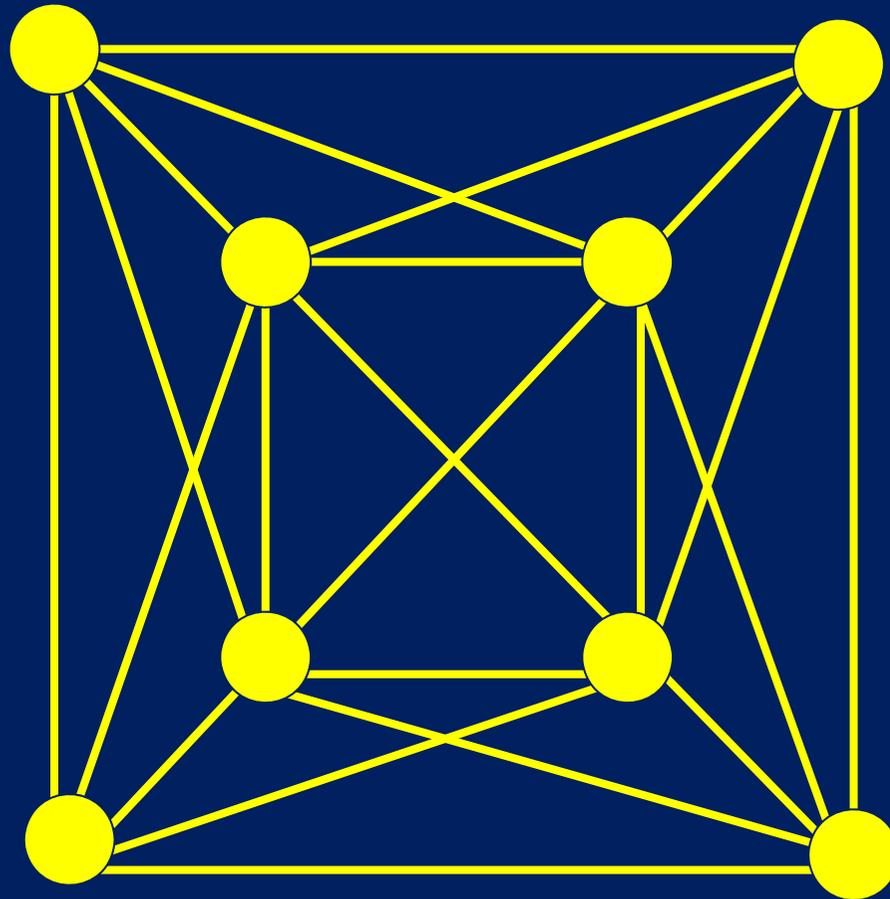
Else

- Use SPQR tree in a recursive way to build a drawing.

***Relationships between the various classes of slightly non-planar graphs:-***

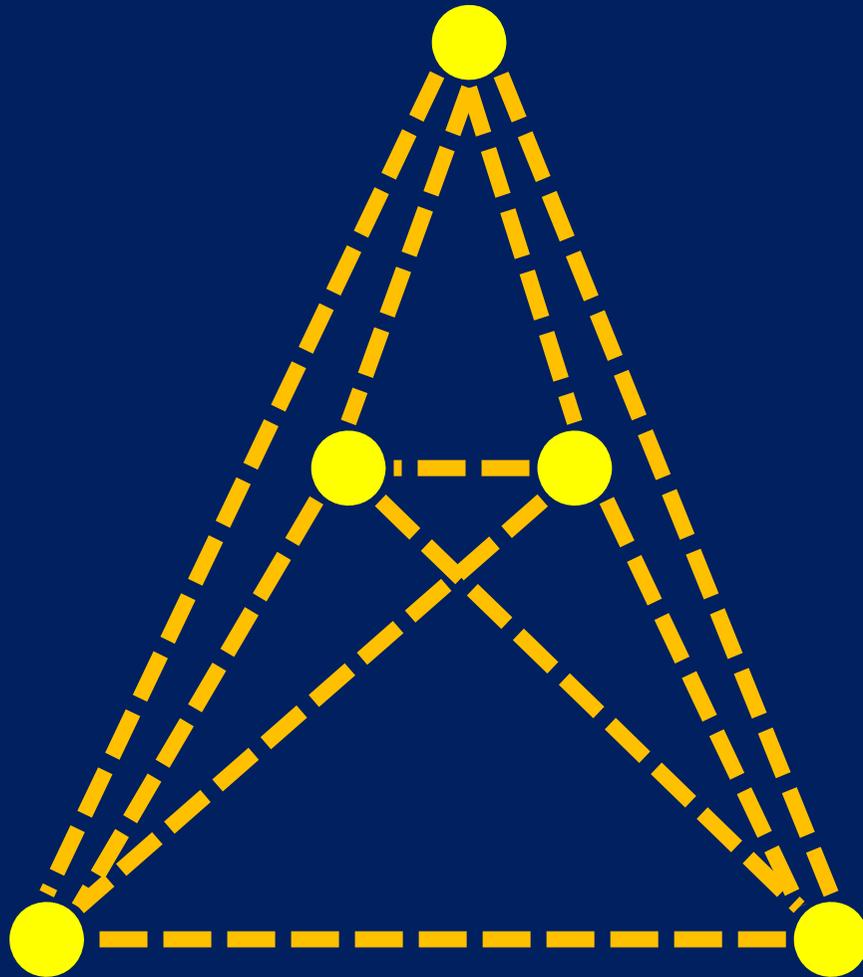
Observation1

There are 1-planar graphs that are not RAC.

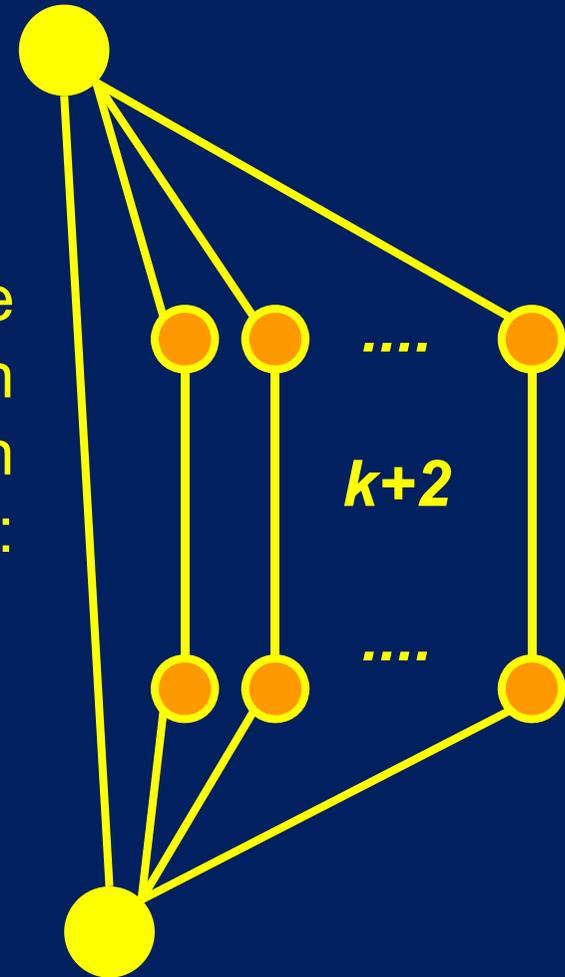


Observation 2

There are RAC graphs that are not 1-planar.

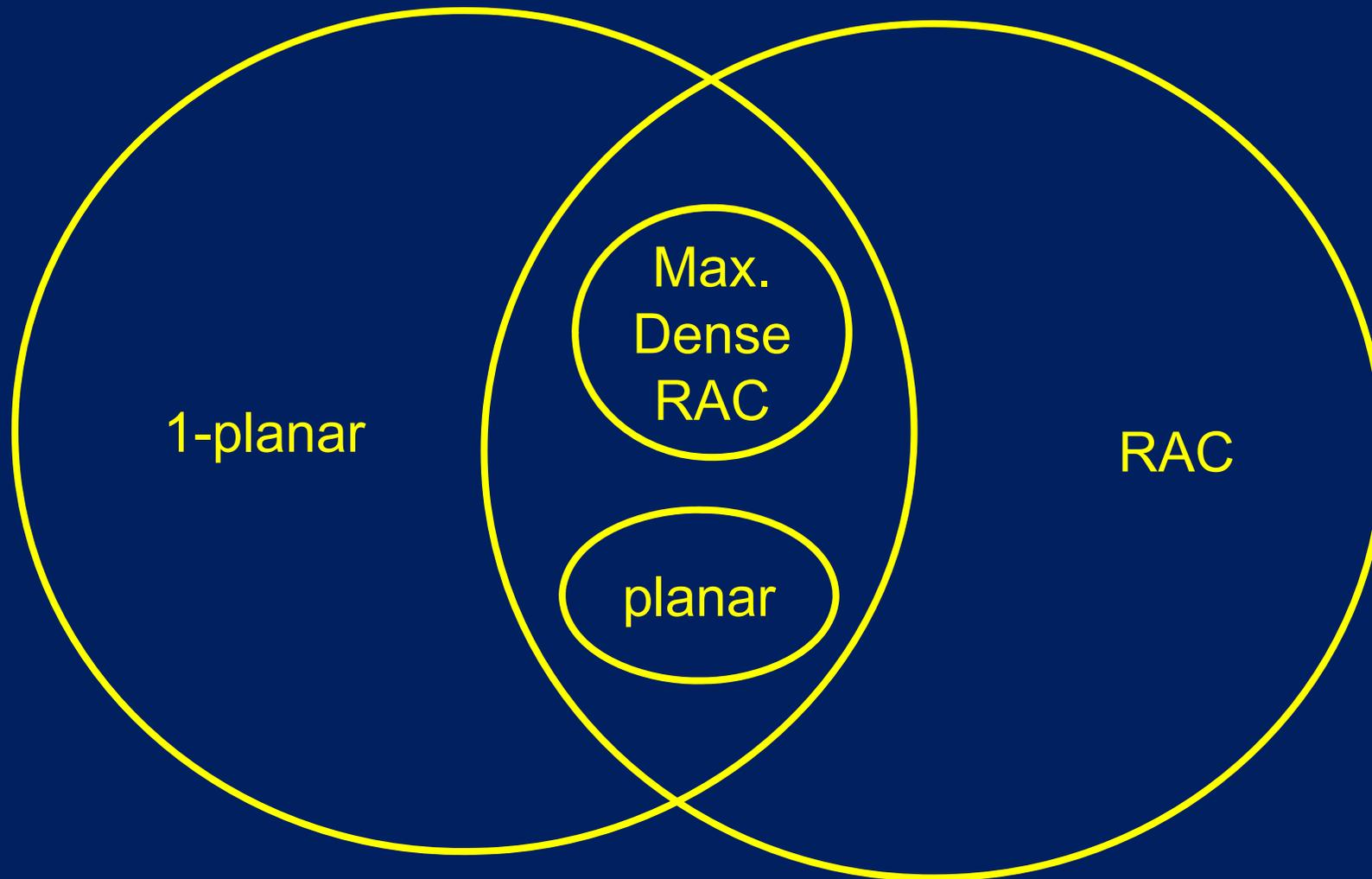


Replace  
each  
edge in  
 $K_5$  with:



Theorem (Liotta, Eades)

If  $G$  is RAC and has  $4n-10$  edges, then  $G$  is 1-planar.



Final remarks

## Other classes of slightly-non-planar graphs

- 2-planar: each edge has at most 2 crossings
- Quasi-planar: no three edges mutually cross each other
- Fan-crossing-free: no pair of incident edges cross another edge
- Twist-crossing-free: no path of length 3 crosses itself
- 1-skew: deletion of one edge makes it planar

Open problems for *curious* people

<b>Class</b>	<b>Maximum density</b>	<b>Computing topology</b>	<b>Computing straight-line drawing</b>
Planar	$3n-6$	Linear time	Linear time
1-planar	$4n-8$	NP-hard	Linear time*
Fan-crossing-free	?	?	?
Twist-crossing-free	?	?	?
Quasi-planar	$6.5n-20$	?	?
Right-angle-crossing (RAC)	$4n-10$	NP-hard	?
1-skew	$3n-5$	Quadratic(?)	Linear time*
...	...	...	...

## Wild conjecture

Suppose that  $H$  is a topological graph, other than a pair of crossing edges.

Then the following problem is NP-hard.

Instance: A graph  $G$

Question: Does  $G$  have a topological embedding in which  $H$  is not a subgraph?

Open problems for *practical* people with some mathematical skills

We say that a graph drawing  $D$  has crossing resolution  $\Theta(D)$  if each crossing angle is at least  $\Theta$ .

1. Investigate graph drawings  $D$  with  $\Theta(D) \geq \pi/3$ .

2. Consider the following problem:

*Maximum Crossing Resolution*

*Input: a graph  $G$*

*Output: a drawing  $D$  of  $G$  with maximum crossing resolution  $\Theta(D)$ .*

Isolate the continuous and discrete parts of this optimisation problem.

Open problems for people with some HCI/Psych skills

Investigate the perceptual and mathematical relationships between crossing resolution and the number of crossings.

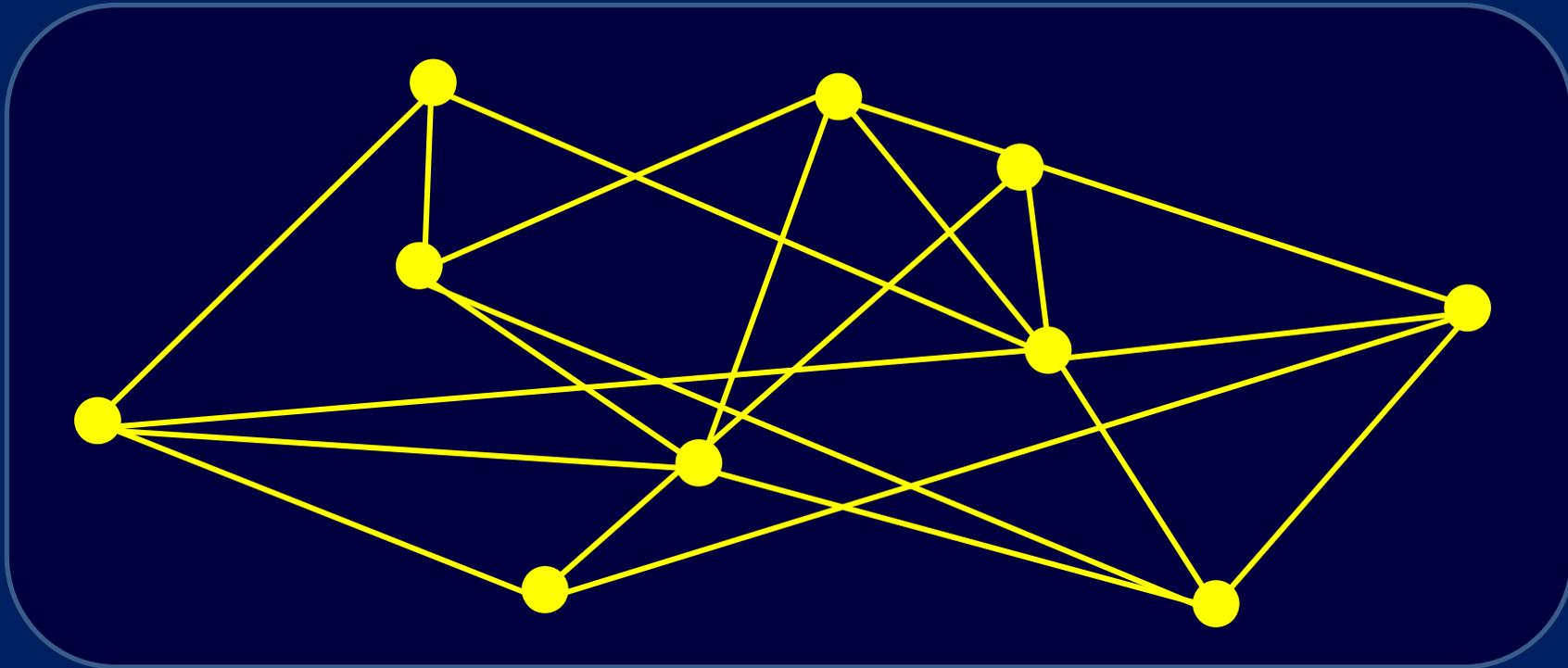
Open problems for practical people with lots of mathematical skills:

Randomisation

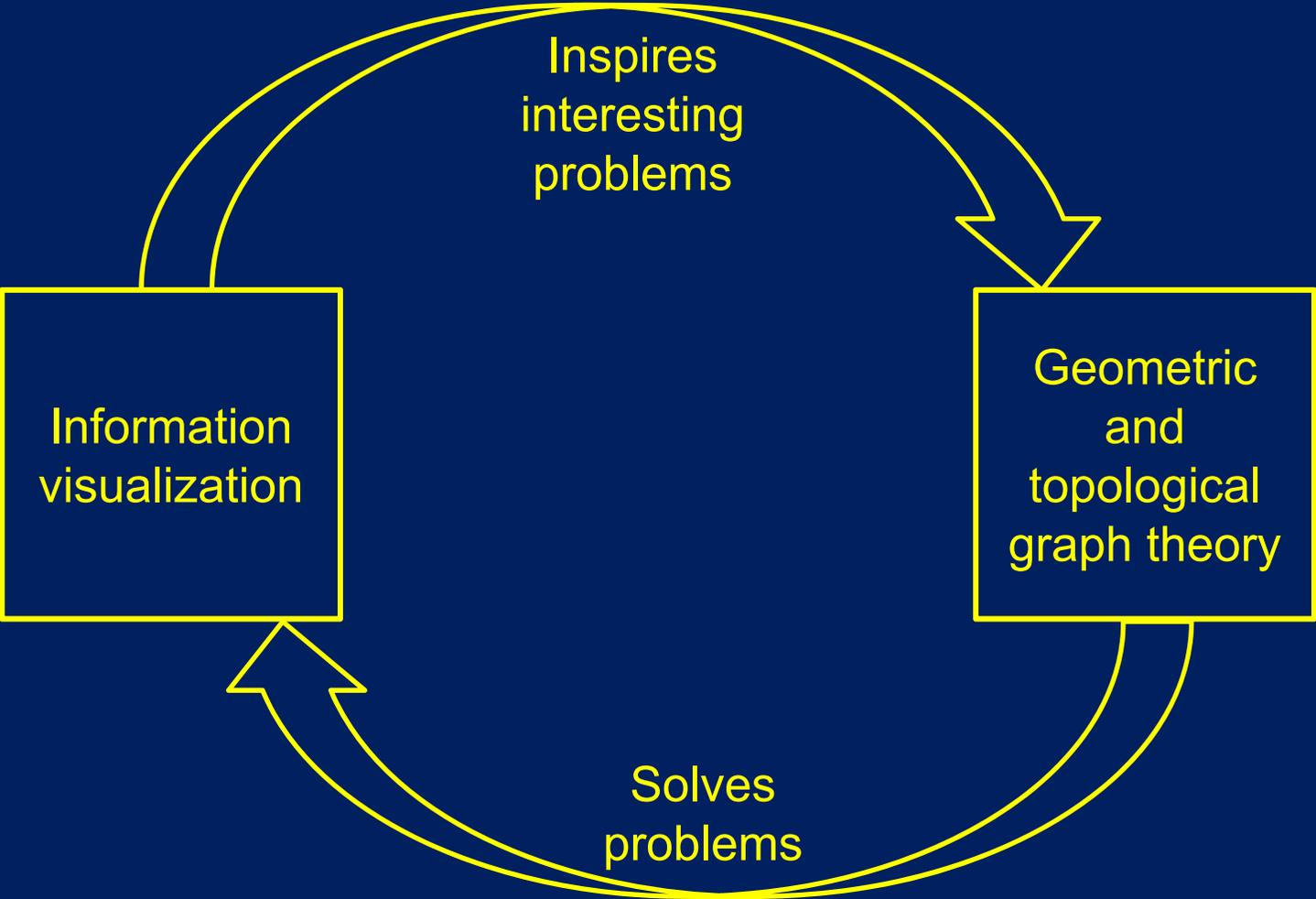
- In a “random” graph drawing with “short” edges:
  - How many edge crossings?
  - What is the crossing resolution?
  - What is the vertex resolution?
  - How do these parameters vary with graph theoretic parameters, such as diameter?
  
- Implications for graph drawing algorithms
  - Can we design algorithms that exploit randomization?
  - Can we provide stochastic guarantees of performance?

Open problem for computational geometry people:-

- Given a straight-line graph drawing, what is the smallest crossing angle?

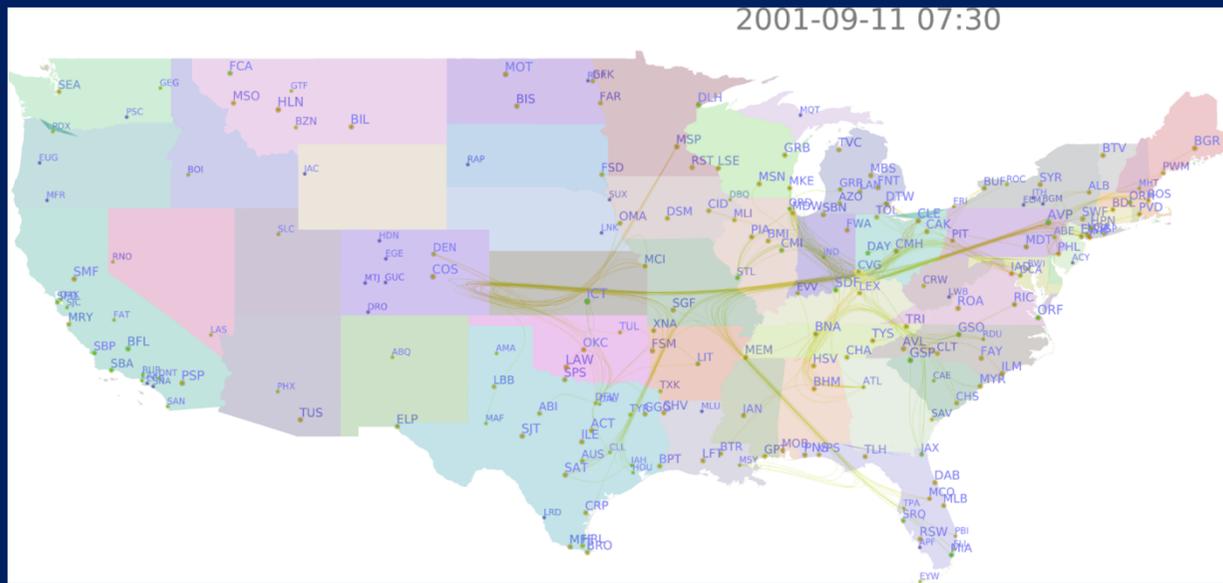


General open problems

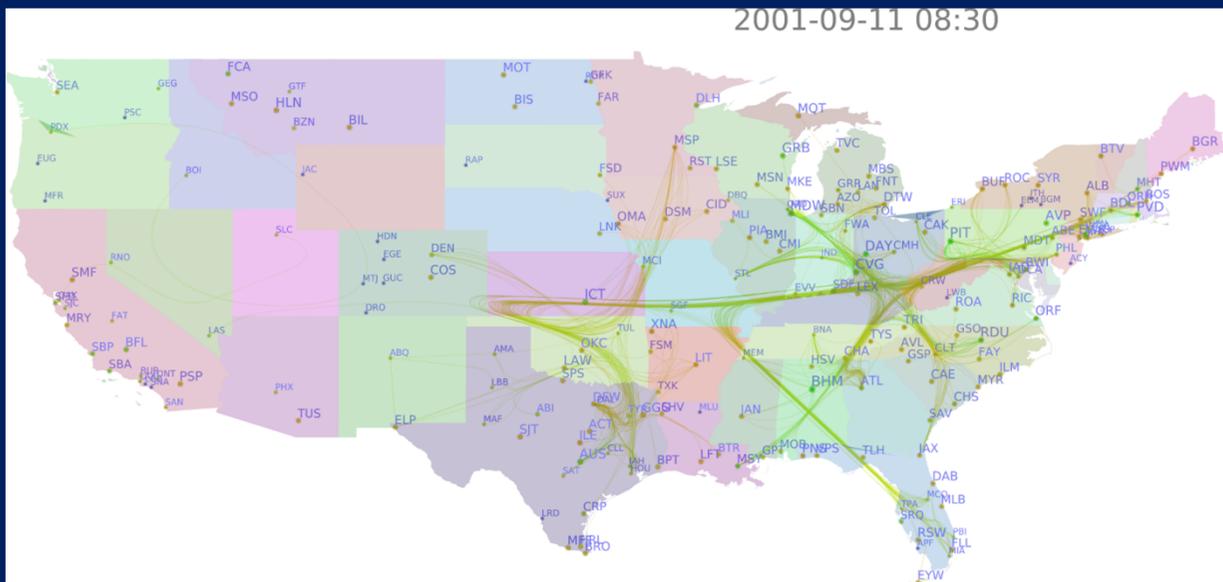


Play video ...

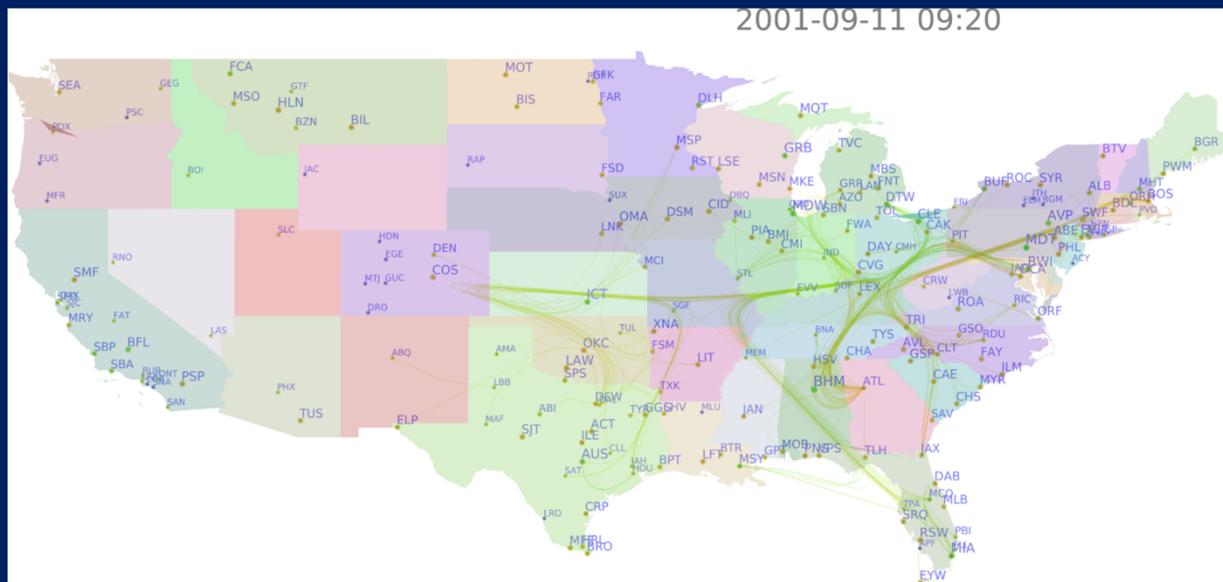
# Quan Nguyen: edge bundling problems



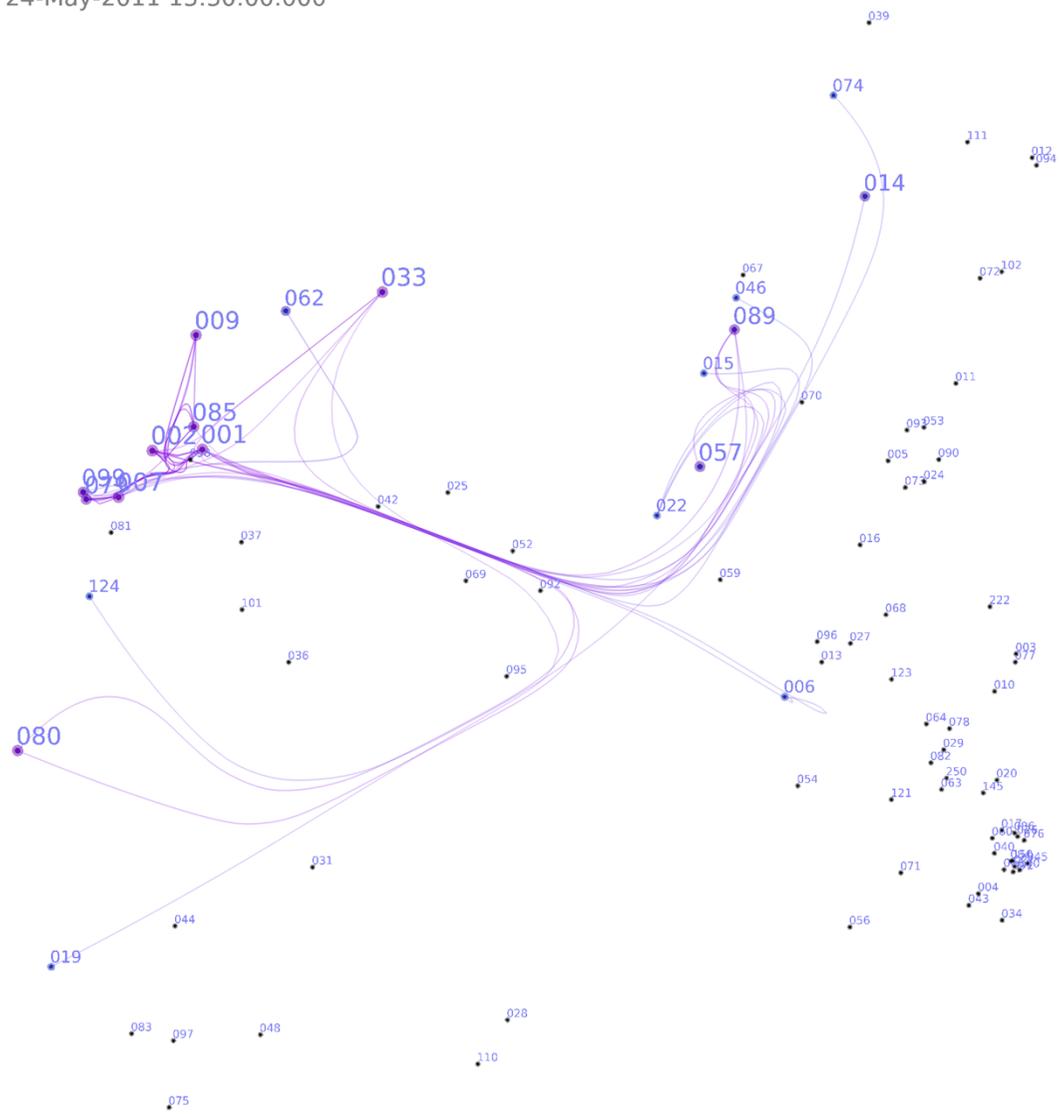
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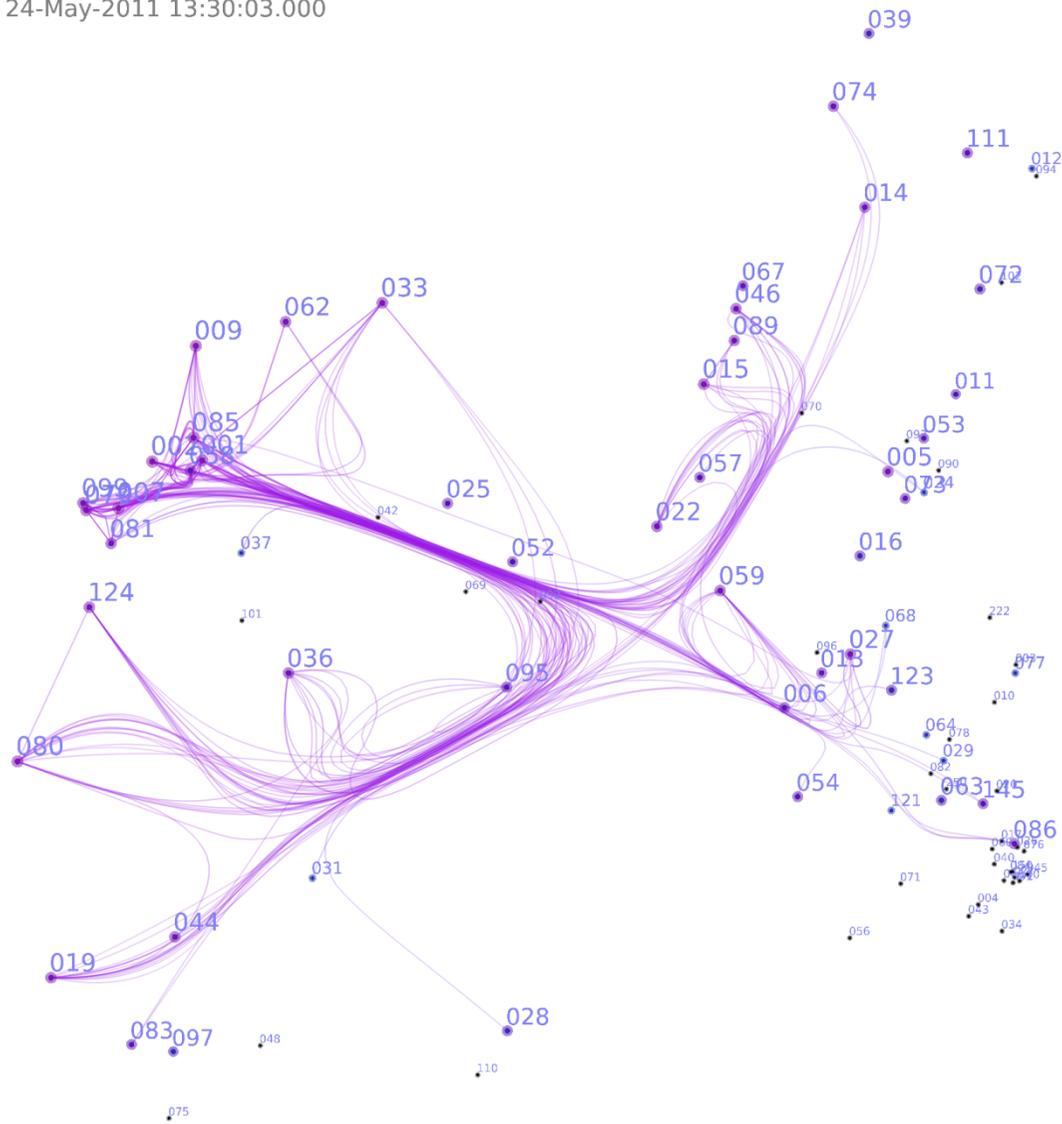
2001-09-11 09:20



24-May-2011 13:30:00.000



24-May-2011 13:30:03.000



## Problems:

- What mathematically-sound measures of edge bundling pictures define good visualizations?
- What algorithms can be used to optimise these measures?
- What are the mathematical limits on geometric graphs with as a function of these measures?

Final final conjecture ....

## Tutte's barycentre algorithm

Scientific world

### Planarity-based methods

- Good underpinning by theory
  - ✓ Mathematical
  - ✓ Psychological
- Empirical evidence of quality
- Seldom used in practice
- No patents
- Planarity algorithms are difficult to code

### Force directed methods

- Not many scientific assertions of quality
- Very little empirical validation
- Almost no underlying theory
- Universally used in practice
- Many patents
- Many force-directed methods are easy-to-code versions
- Flexible, can easily accommodate constraints

Commercial world

Conjecture:

Investigations of slightly-non-planar graphs will lead to more commercial value for planarity-based methods