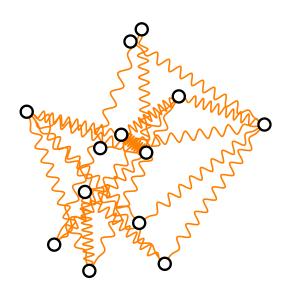


Visualization of Graphs

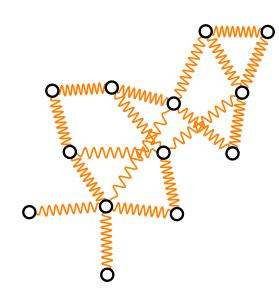
Lecture 2:

Force-Directed Drawing Algorithms



Part I: Algorithmic Framework

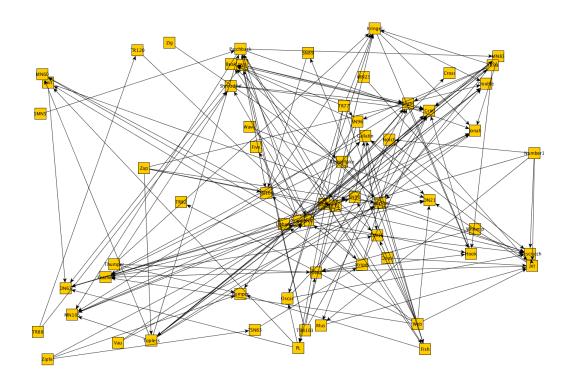
Alexander Wolff

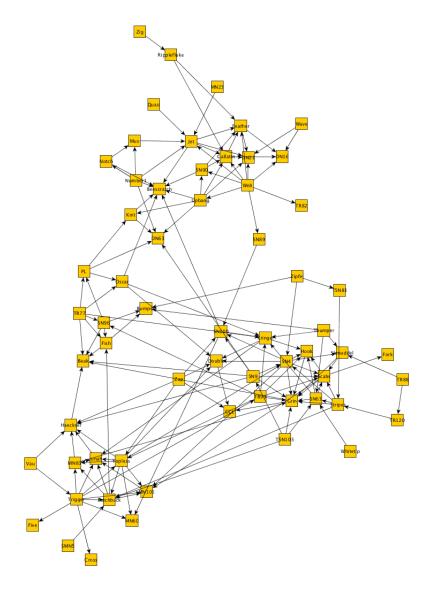


General Layout Problem

Input: Graph G

Output: Clear and readable straight-line drawing of G





General Layout Problem

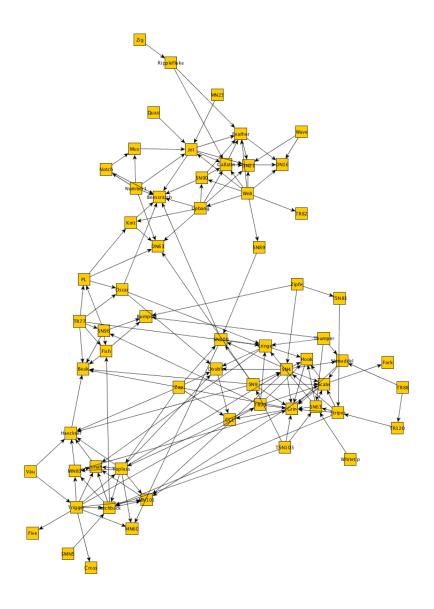
Input: Graph G

Output: Clear and readable straight-line drawing of G

Drawing aesthetics:

- adjacent vertices are close
- non-adjacent vertices are far apart
- edges short, straight-line, similar length
- densely connected parts (clusters) form communities
- as few crossings as possible
- nodes distributed evenly

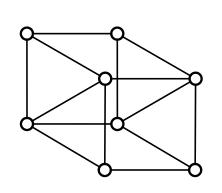
Optimization criteria partially contradict each other.

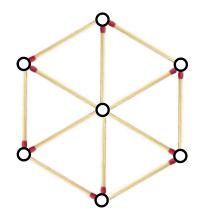


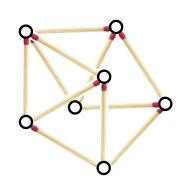
Fixed Edge Lengths?

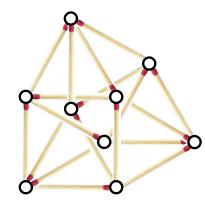
Input: Graph G, required edge length $\ell(e)$ for each $e \in E(G)$.

Output: Drawing of G that realizes the given edge lengths.







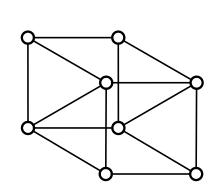


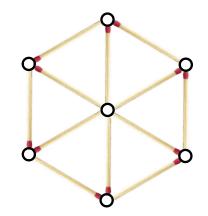
NP-hard for

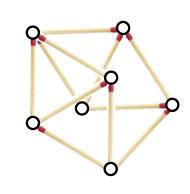
Fixed Edge Lengths?

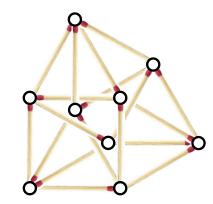
Input: Graph G, required edge length $\ell(e)$ for each $e \in E(G)$.

Output: Drawing of G that realizes the given edge lengths.









NP-hard for

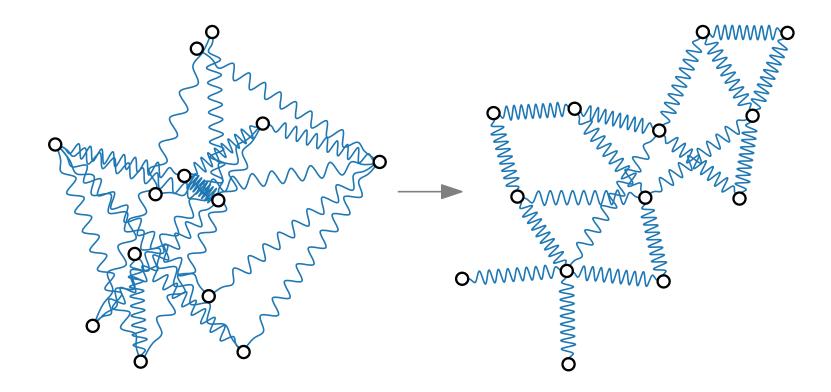
- uniform edge lengths in any dimension [Johnson '82]
- uniform edge lengths in planar drawings [Eades, Wormald '90]
- \blacksquare edge lengths $\{1,2\}$ [Saxe '80]

Physical Analogy

Idea.

[Eades '84]

"To embed a graph we replace the vertices by steel rings and replace each edge with a **spring** to form a mechanical system ... The vertices are placed in some initial layout and let go so that the spring forces on the rings move the system to a minimal energy state."



Physical Analogy

Idea.

[Eades '84]

"To embed a graph we replace the vertices by steel rings and replace each edge with a spring to form a mechanical system ... The vertices are placed in some initial layout and let go so that the spring forces on the rings move the system to a minimal energy state."

So-called spring-embedder algorithms that work according to this or similar principles are among the most frequently used graph-drawing methods in practice.

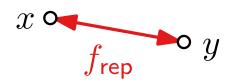
Attractive forces.

pairs $\{u, v\}$ of adjacent vertices:

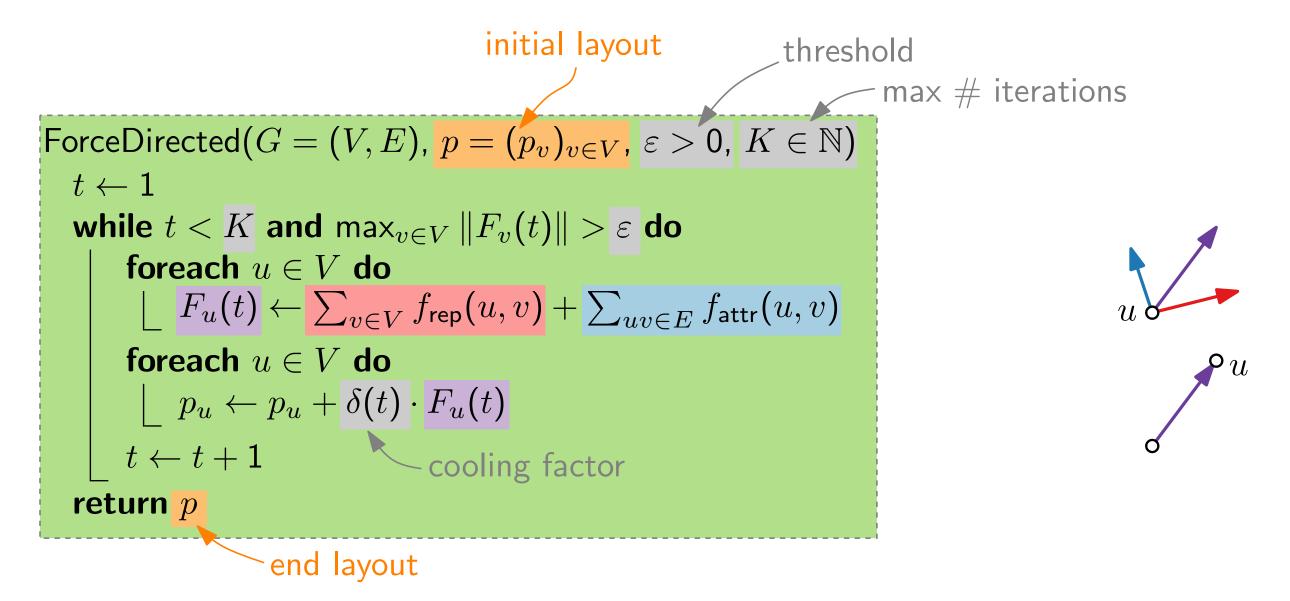
$$u$$
 ommo v f_{attr}

Repulsive forces.

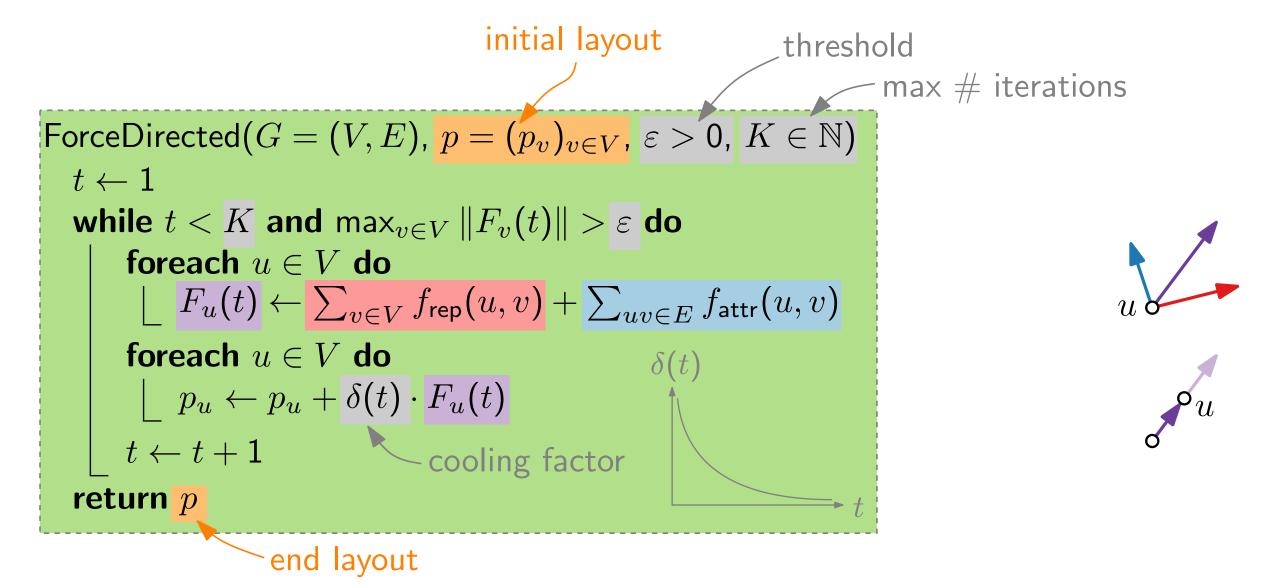
any pair $\{x, y\}$ of vertices:



Force-Directed Algorithms



Force-Directed Algorithms

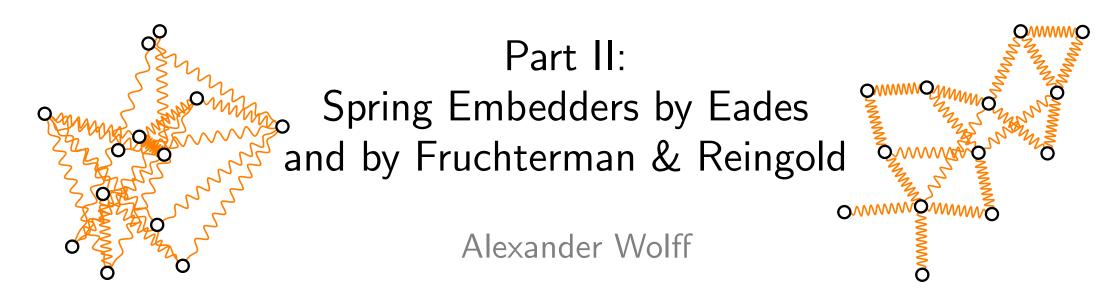




Visualization of Graphs

Lecture 2:

Force-Directed Drawing Algorithms



Spring Embedder by Eades – Model

Repulsive forces repulsion constant (e.g., 2.0) $f_{\mathsf{rep}}(u,v) = \frac{c_{\mathsf{rep}}}{\|p_v - p_v\|^2} \cdot \overline{p_v p_u}$

■ Attractive forces spring constant (e.g., 1.0)

$$f_{\mathsf{spring}}(u,v) = c_{\mathsf{spring}} \cdot \log \frac{\|p_v - p_u\|}{\ell} \cdot \overrightarrow{p_u p_v}$$

$$f_{\mathsf{attr}}(u,v) = f_{\mathsf{spring}}(u,v) - f_{\mathsf{rep}}(u,v)$$

Resulting displacement vector

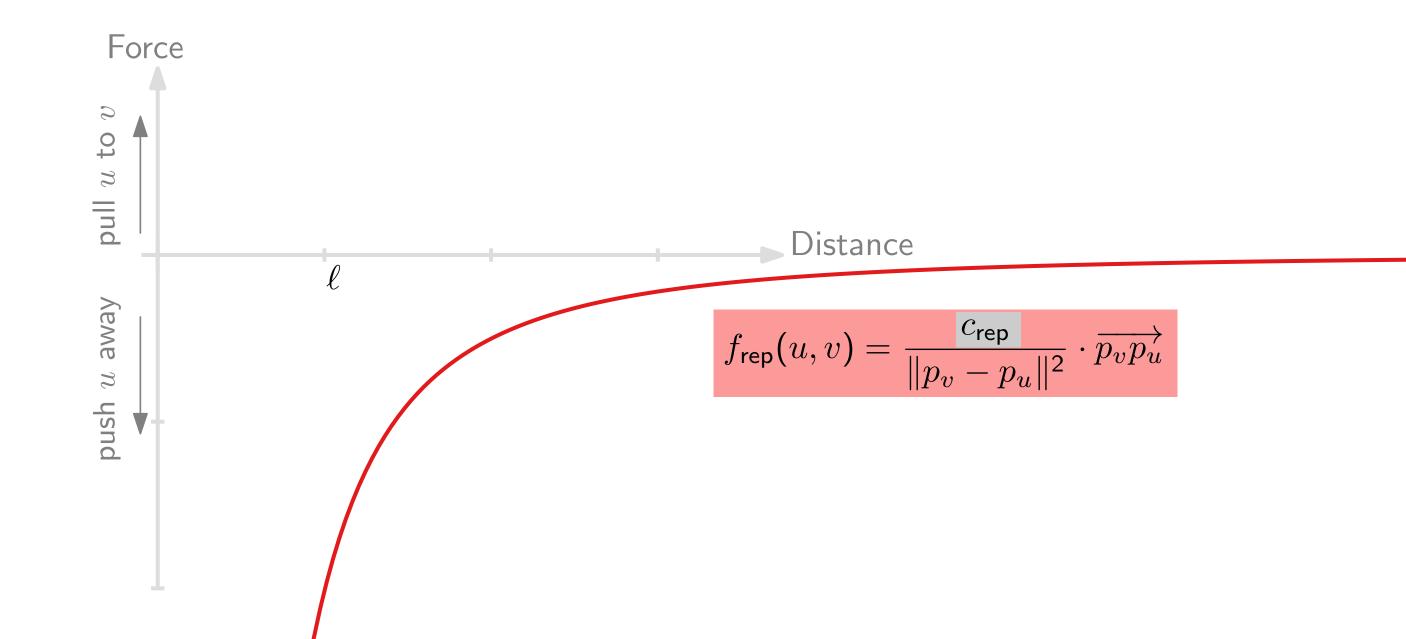
$$F_u = \sum_{v \in V} f_{\mathsf{rep}}(u, v) + \sum_{v \in \mathsf{Adj}[u]} f_{\mathsf{attr}}(u, v)$$

```
ForceDirected(G = (V, E), \ p = (p_v)_{v \in V}, \ \varepsilon > 0, \ K \in \mathbb{N})
t \leftarrow 1
while t < K and \max_{v \in V} \|F_v(t)\| > \varepsilon do
\begin{array}{c|c} \text{foreach } u \in V \text{ do} \\ & L_u(t) \leftarrow \sum_{v \in V} f_{\mathsf{rep}}(u, v) + \sum_{v \in \mathsf{Adj}[u]} f_{\mathsf{attr}}(u, v) \\ \text{foreach } u \in V \text{ do} \\ & L_v \leftarrow p_u + \delta(t) \cdot F_u(t) \\ & L \leftarrow t + 1 \\ \text{return } p \end{array}
```

Notation.

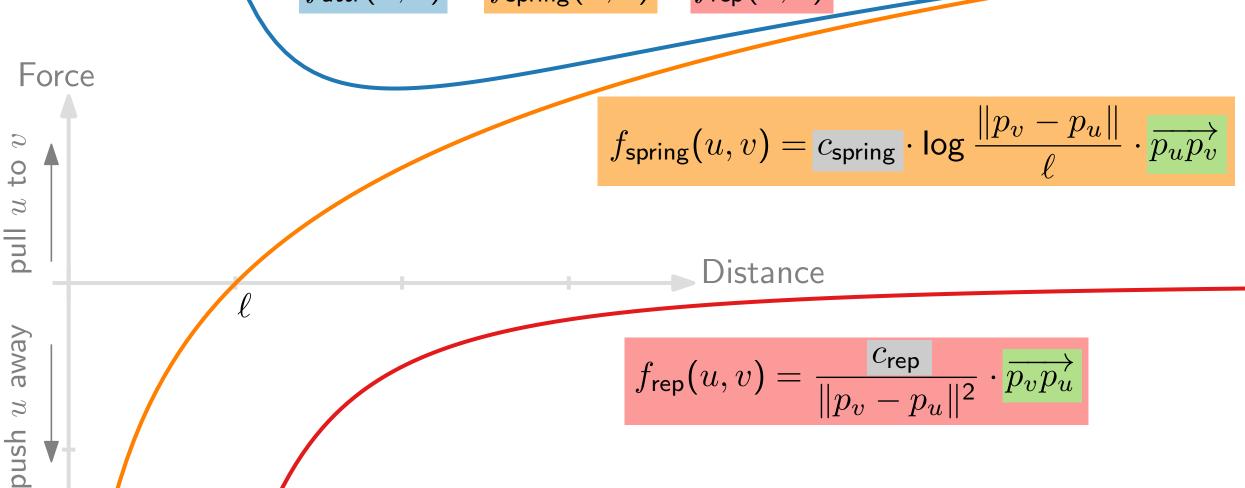
- $\overrightarrow{p_up_v} = \text{unit vector}$ pointing from u to v
- $\|p_u p_v\| =$ Euclidean distance between u and v
- ℓ = ideal spring length for edges

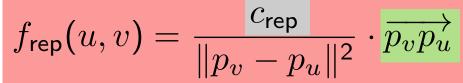
Spring Embedder by Eades – Force Diagram



Spring Embedder by Eades – Force Diagram

$$f_{\mathsf{attr}}(u,v) = f_{\mathsf{spring}}(u,v) - f_{\mathsf{rep}}(u,v)$$





Spring Embedder by Eades – Discussion

Advantages.

Spring Embedder by Eades – Discussion

Advantages.

- very simple algorithm
- good results for small and medium-sized graphs
- empirically good representation of symmetry and structure

Disadvantages.

- System may not be stable at the end.
- Converging to local minima.
- Computation of f_{spring} in $\mathcal{O}(|E(G)|)$ time and f_{rep} in $\mathcal{O}(|V(G)|^2)$ time.

Influence.

- lacktriangle original paper by Peter Eades [Eades '84] got \sim 2000 citations
- basis for many further ideas

Variant by Fruchterman & Reingold

Repulsive forces

$$f_{\text{rep}}(u,v) = \frac{c_{\text{rep}}}{\|p_v - p_u\|^2} \cdot \overrightarrow{p_v p_u}$$

Attractive forces

$$f_{\mathsf{spring}}(u,v) = c_{\mathsf{spring}} \cdot \log \frac{\|p_v - p_u\|}{\ell} \cdot \overrightarrow{p_u p_v}$$

$$f_{\mathsf{attr}}(u,v) = f_{\mathsf{spring}}(u,v) - f_{\mathsf{rep}}(u,v)$$

Resulting displacement vector

$$F_u = \sum_{v \in V} f_{\mathsf{rep}}(u,v) + \sum_{v \in \mathsf{Adj}[u]} f_{\mathsf{attr}}(u,v)$$

Notation.

- $\|p_u p_v\| =$ Euclidean distance between u and v
- $\overrightarrow{p_up_v} = \text{unit vector}$ pointing from u to v
- ℓ = ideal spring length for edges

Variant by Fruchterman & Reingold

Repulsive forces

$$f_{\mathsf{rep}}(u,v) = \frac{\ell^2}{\|p_v - p_u\|} \cdot \overrightarrow{p_v p_u}$$

Attractive forces

$$f_{\mathsf{attr}}(u,v) = \frac{\|p_v - p_u\|^2}{\ell} \cdot \overrightarrow{p_u p_v}$$

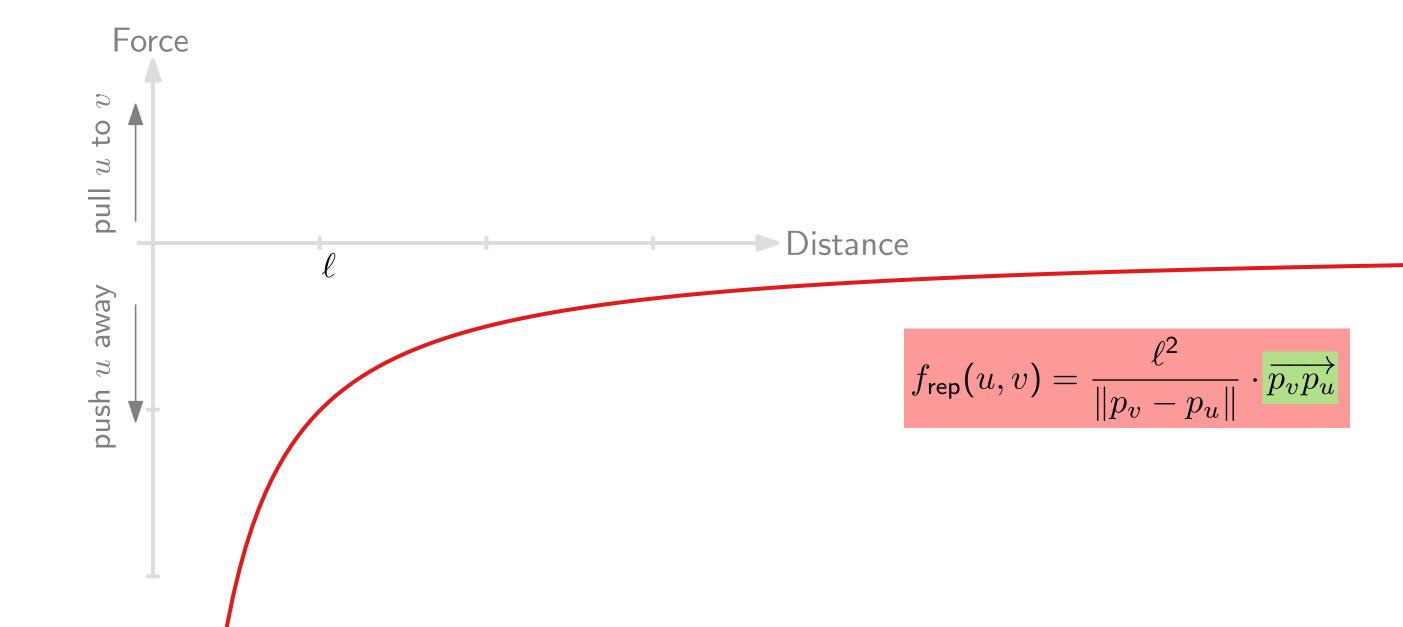
Resulting displacement vector

$$F_u = \sum_{v \in V} f_{\mathsf{rep}}(u,v) + \sum_{v \in \mathsf{Adj}[u]} f_{\mathsf{attr}}(u,v)$$

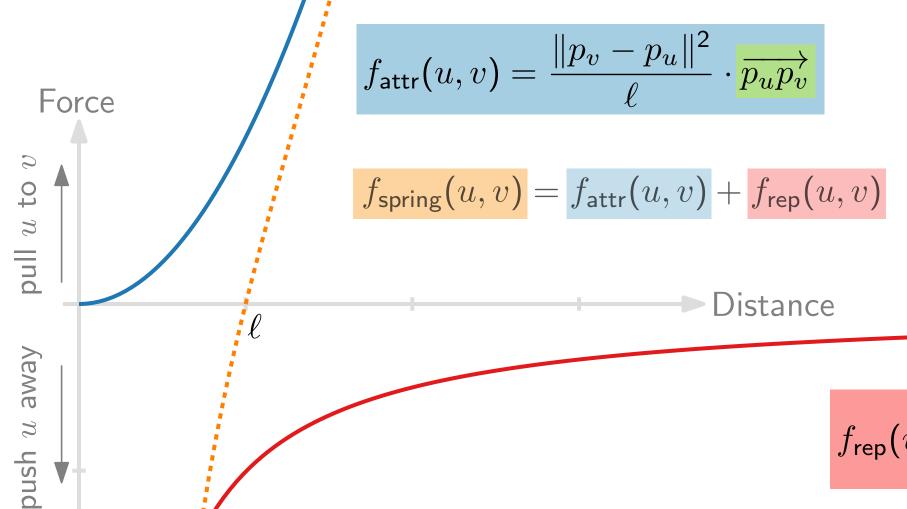
Notation.

- $\|p_u p_v\| =$ Euclidean distance between u and v
- $\overrightarrow{p_up_v} = \text{unit vector}$ pointing from u to v
- $\ell=$ ideal spring length for edges

Fruchterman & Reingold – Force Diagram



Fruchterman & Reingold – Force Diagram



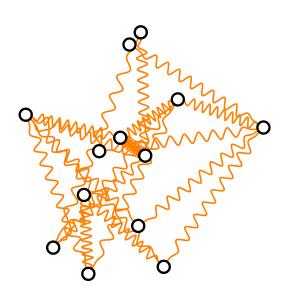
$$f_{\mathsf{rep}}(u,v) = \frac{\ell^2}{\|p_v - p_u\|} \cdot \overrightarrow{p_v p_u}$$



Visualization of Graphs

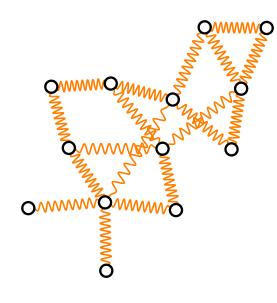
Lecture 2:

Force-Directed Drawing Algorithms



Part III: Variants & Improvements

Alexander Wolff



Adaptability

Inertia.

- Define vertex mass $\Phi(v) = 1 + \deg(v)/2$
- Set $f_{\mathsf{attr}}(p_u, p_v) \leftarrow f_{\mathsf{attr}}(p_u, p_v) \cdot 1/\Phi(v)$

Gravitation.

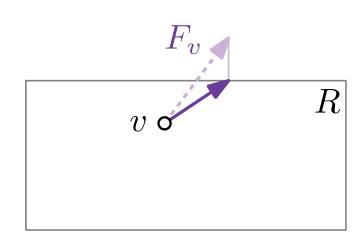
- Define centroid $p_{\mathsf{bary}} = 1/|V| \cdot \sum_{v \in V} p_v$
- lacktriangle Add force $f_{\mathsf{grav}}(p_v) = c_{\mathsf{grav}} \cdot \Phi(v) \cdot \overrightarrow{p_v p_{\mathsf{bary}}}$

Restricted drawing area.

If F_v points beyond area R, clip vector appropriately at the border of R.

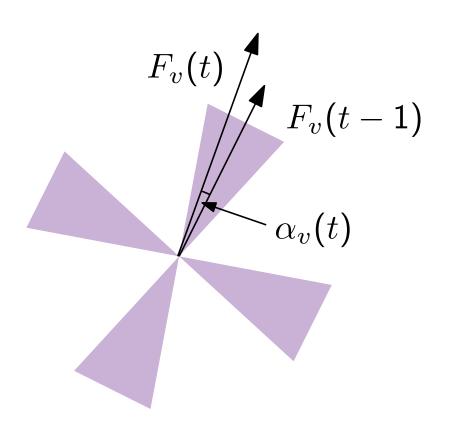
And many more...

- magnetic orientation of edges [GD Ch. 10.4]
- other energy models
- planarity preserving
- speed-ups



```
ForceDirected(G = (V, E), p = (p_v)_{v \in V}, \varepsilon > 0, K \in \mathbb{N})
  t \leftarrow 1
  while t < K and \max_{v \in V} ||F_v(t)|| > \varepsilon do
       foreach u \in V do
        F_u(t) \leftarrow \sum_{v \in V} f_{\mathsf{rep}}(u, v) + \sum_{uv \in E} f_{\mathsf{attr}}(u, v)
      foreach u \in V do
      return p
```

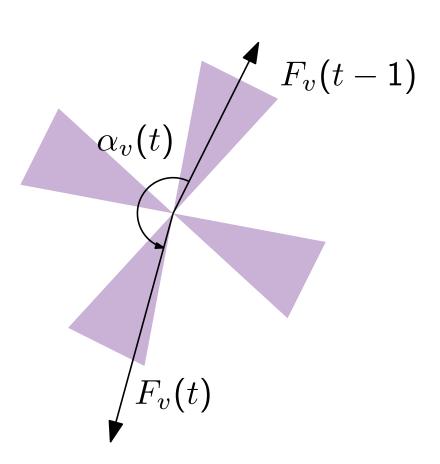
[Frick, Ludwig, Mehldau '95]



Same direction.

 \rightarrow increase temperature $\delta_v(t)$

[Frick, Ludwig, Mehldau '95]



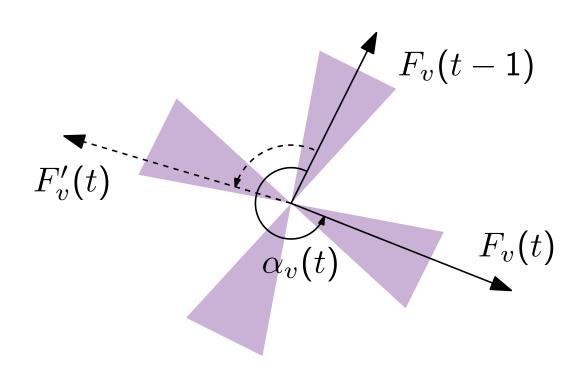
Same direction.

 \rightarrow increase temperature $\delta_v(t)$

Oszillation.

 \rightarrow decrease temperature $\delta_v(t)$

[Frick, Ludwig, Mehldau '95]



Same direction.

 \rightarrow increase temperature $\delta_v(t)$

Oszillation.

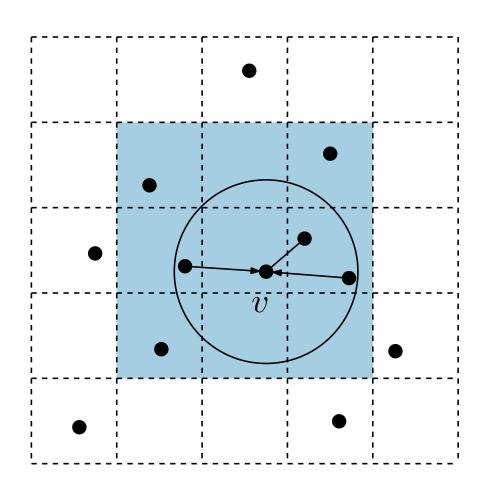
 \rightarrow decrease temperature $\delta_v(t)$

Rotation.

- count rotations
- if applicable
- \rightarrow decrease temperature $\delta_v(t)$

Speeding up "Convergence" via Grids

[Fruchterman & Reingold '91]



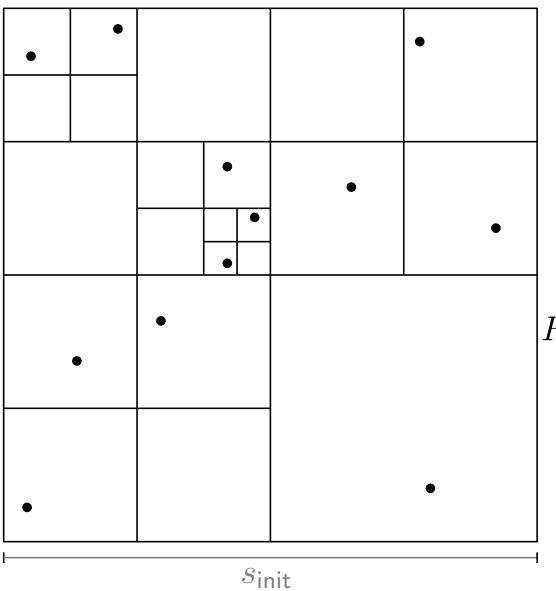
- divide plane into grid
- consider repelling forces only to vertices in neighboring cells
- and only if distance is less than some max distance

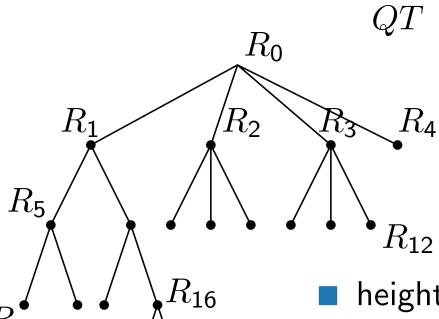
Discussion.

- good idea to improve actual runtime
- asymptotic runtime does not improve
- might introduce oszillation and thus a quality loss

Speeding up with Quad Trees

[Barnes, Hut '86]

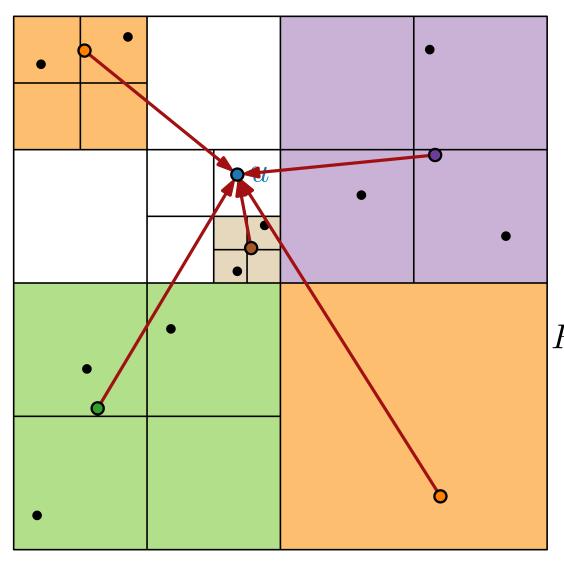


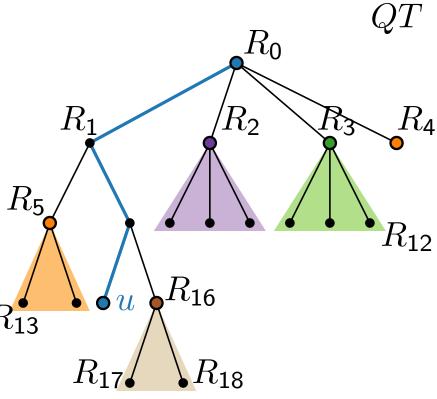


- lacktriangle time/space in $\mathcal{O}(hn)$
- compressed quad tree can be computed in $\mathcal{O}(n \log n)$ time
- $h \in \mathcal{O}(\log n)$ if vertices evenly distributed

Speeding up with Quad Trees

[Barnes, Hut '86]





$$f_{\mathsf{rep}}(R_i, p_u) = |R_i| \cdot f_{\mathsf{rep}}(\sigma_{R_i}, p_u)$$

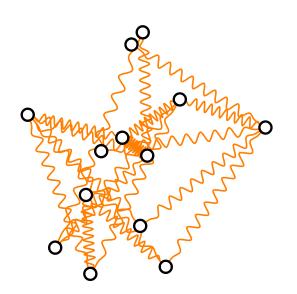
for each child R_i of a vertex on path from u to root.



Visualization of Graphs

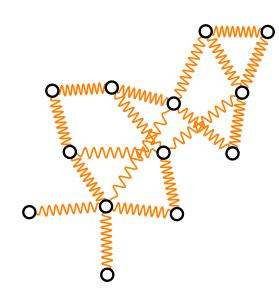
Lecture 2:

Force-Directed Drawing Algorithms



Part IV:
Tutte Embedding

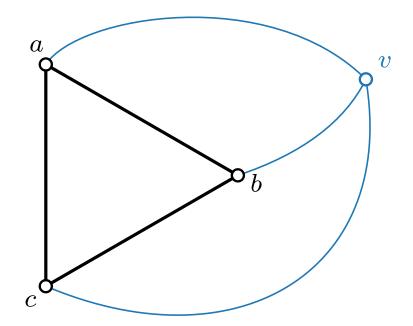
Alexander Wolff

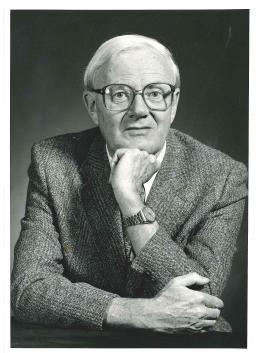


Idea

Consider a fixed triangle (a, b, c) with one common neighbor v

Where would you place v?



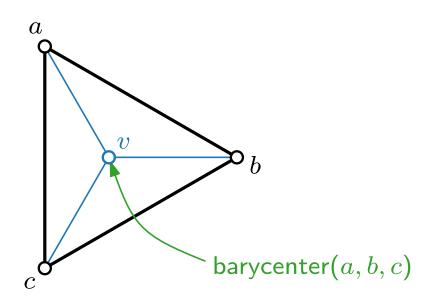


William T. Tutte 1917 – 2002

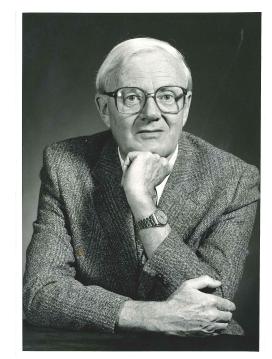
Idea

Consider a fixed triangle (a, b, c) with one common neighbor v

Where would you place v?



barycenter
$$(x_1, \ldots, x_k) = \sum_{i=1}^k x_i/k$$



William T. Tutte 1917 – 2002

Idea.

Repeatedly place every vertex at barycenter of neighbors.

Tutte's Forces

Goal.

$$p_u = \text{barycenter}(\text{Adj}[u])$$

= $\sum_{v \in \text{Adj}(u)} p_v / \deg(u)$

$$\begin{aligned} F_u(t) &= \sum_{uv \in E} p_v / \deg(u) - p_u \\ &= \sum_{v \in \mathsf{Adj[u]}} (p_v - p_u) / \deg(u) \\ &= \sum_{v \in \mathsf{Adj[u]}} \|p_u - p_v\| / \deg(u) \end{aligned}$$

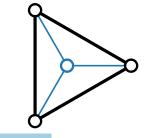
ForceDirected $(G=(V,E), p=(p_v)_{v\in V}, \varepsilon>0, K\in\mathbb{N})$ $t \leftarrow 1$ while t < K and $\max_{v \in V} ||F_v(t)|| > \varepsilon$ do foreach $u \in V$ do $F_u(t) \leftarrow \sum_{v \in V} f_{\text{rep}}(u, v) + \sum_{v \in \text{Adj[u]}} f_{\text{attr}}(u, v)$ foreach $u \in V$ do $p_u \leftarrow p_u + \delta(t) \cdot F_u(t)$ $t \leftarrow t + 1$ barycenter $(x_1,\ldots,x_k)=\sum_{i=1}^k x_i/k$ return p

Solution: $p_u = (0,0) \ \forall u \in V$

Repulsive forces

$$f_{\mathsf{rep}}(u,v) = 0$$

■ Attractive forces



Fix coordinates of outer face!

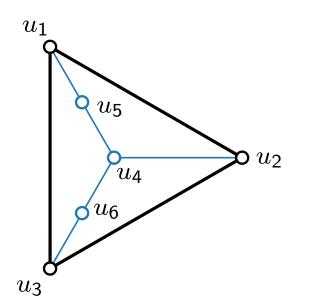
$$f_{\mathsf{attr}}(u,v) = \begin{cases} 0 & \text{if } u \text{ fixed,} \\ \frac{1}{\mathsf{deg}(u)} \cdot \|p_u - p_v\| & \text{otherwise.} \end{cases}$$

Linear System of Equations

Goal.
$$p_u = (x_u, y_u)$$

$$p_u = \mathsf{barycenter}(\mathsf{Adj[u]}) = \sum_{v \in \mathsf{Adj[u]}} p_v / \mathsf{deg}(u)$$

$$\begin{aligned} x_u &= \sum_{v \in \mathsf{Adj[u]}} x_v / \deg(u) &\Leftrightarrow \deg(u) \cdot x_u = \sum_{v \in \mathsf{Adj[u]}} x_v \Leftrightarrow \deg(u) \cdot x_u - \sum_{v \in \mathsf{Adj[u]}} x_v = 0 \\ y_u &= \sum_{v \in \mathsf{Adj[u]}} y_v / \deg(u) &\Leftrightarrow \deg(u) \cdot y_u = \sum_{v \in \mathsf{Adj[u]}} y_v \Leftrightarrow \deg(u) \cdot y_u - \sum_{v \in \mathsf{Adj[u]}} y_v = 0 \end{aligned}$$



Laplacian matrix of G

n variables, n constraints, det(A) = 0 \Rightarrow no unique solution

$$\boldsymbol{A}$$

$$A_{ii} = \deg(u_i)$$

$$A_{ij,i \neq j} = \begin{cases} -1 & u_i u_j \in E \\ 0 & u_i u_j \notin E \end{cases}$$

Ax = b Ay = b $b = (0)_n$

Two Systems of linear equations:



Linear System of Equations

Goal.
$$p_u = (x_u, y_u)$$

 $p_u = \text{barycenter(Adj[u])} =$

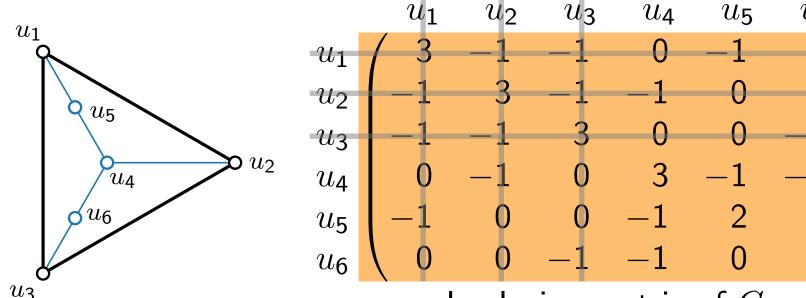
Theorem.

Tutte drawing

Tutte's barycentric algorithm admits a unique solution. It can be computed in polynomial time.

$$x_u = \sum_{v \in \mathsf{Adj[u]}} x_v / \deg(u) \quad \Leftrightarrow \deg(u) \cdot x_u = \sum_{v \in \mathsf{Adj[u]}} x_v \quad \Leftrightarrow \deg(u) \cdot x_u - \sum_{v \in \mathsf{Adj[u]}} x_v = 0$$

$$y_u = \sum_{v \in \mathsf{Adj[u]}} y_v / \deg(u) \quad \Leftrightarrow \deg(u) \cdot y_u = \sum_{v \in \mathsf{Adj[u]}} y_v \quad \Leftrightarrow \deg(u) \cdot y_u - \sum_{v \in \mathsf{Adj[u]}} y_v = 0$$



$$A_{ii} = \deg(u_i)$$

$$A_{ij,i \neq j} = \begin{cases} -1 & u_i u_j \in E \\ 0 & u_i u_j \notin E \end{cases}$$

Laplacian matrix of G

k variables, k constraints, det(A) > 0

$$k = \#$$
free vertices

$$\Rightarrow$$
 unique solution

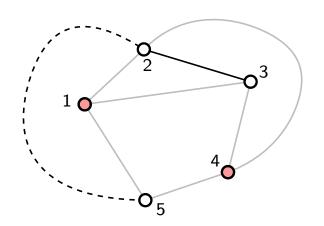
planar: G can be drawn in such a way

that no edges cross each other

connected: $\exists u - v$ path for every vertex pair $\{u, v\}$.

k-connected: $G - \{v_1, \ldots, v_{k-1}\}$ is connected

for any k-1 vertices v_1, \ldots, v_{k-1} .



planar: G can be drawn in such a way

that no edges cross each other

connected: $\exists u - v$ path for every vertex pair $\{u, v\}$.

k-connected: $G - \{v_1, \dots, v_{k-1}\}$ is connected

for any k-1 vertices v_1, \ldots, v_{k-1} .

Or (equivalently):

There are at least k vertex-disjoint

u–v paths for every vertex pair $\{u, v\}$.

Theorem.

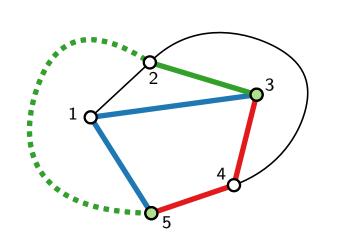
[Whitney 1933]

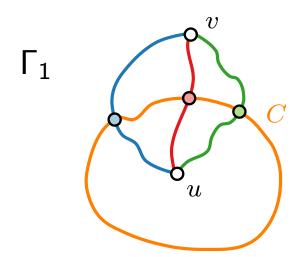
Every 3-connected planar graph has a unique planar embedding.

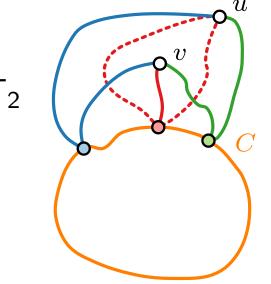
Proof sketch.

 Γ_1, Γ_2 embeddings of G.

Let C be a face of Γ_2 , but not of Γ_1 . u inside C in Γ_1 , v outside C in Γ_1 both on same side in Γ_2







planar: G can be drawn in such a way

that no edges cross each other

connected: $\exists u - v$ path for every vertex pair $\{u, v\}$.

k-connected: $G - \{v_1, \dots, v_{k-1}\}$ is connected

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There are at least k vertex-disjoint

u-v paths for every vertex pair $\{u, v\}$.

Theorem.

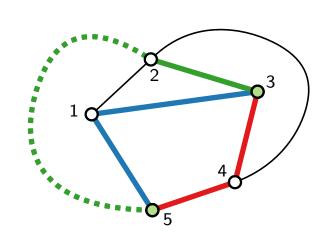
[Whitney 1933]

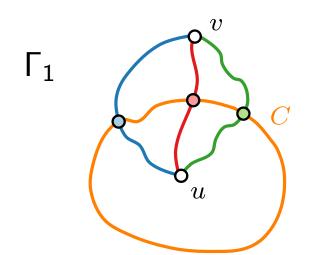
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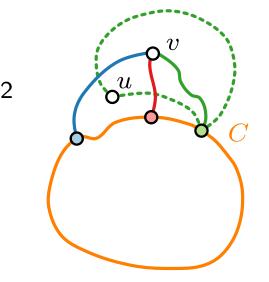
Proof sketch.

 Γ_1, Γ_2 embeddings of G.

Let C be a face of Γ_2 , but not of Γ_1 . u inside C in Γ_1 , v outside C in Γ_1 both on same side in Γ_2







planar: G can be drawn in such a way

that no edges cross each other

connected: $\exists u - v$ path for every vertex pair $\{u, v\}$.

k-connected: $G - \{v_1, \dots, v_{k-1}\}$ is connected

for any k-1 vertices v_1, \ldots, v_{k-1} .

Or (equivalently):

There are at least k vertex-disjoint

u-v paths for every vertex pair $\{u, v\}$.

Theorem.

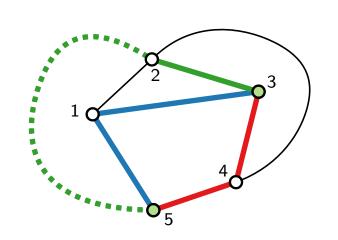
[Whitney 1933]

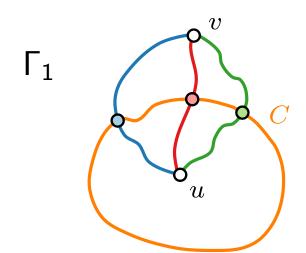
Every 3-connected planar graph has a unique planar embedding.

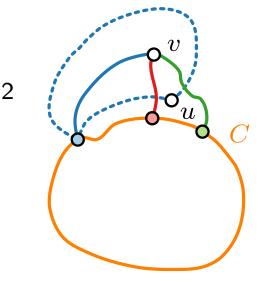
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 Γ_1, Γ_2 embeddings of G.

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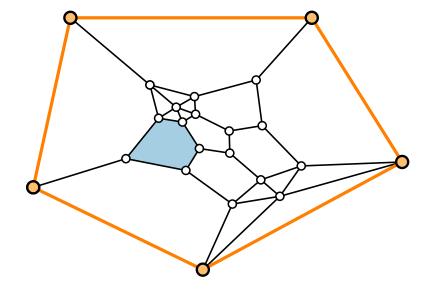


Tutte's Theorem

Theorem.

[Tutte 1963]

Let G be a 3-connected planar graph, and let G be a face of its unique embedding. If we fix G on a strictly convex polygon, then the Tutte drawing of G is planar and all its faces are strictly convex.



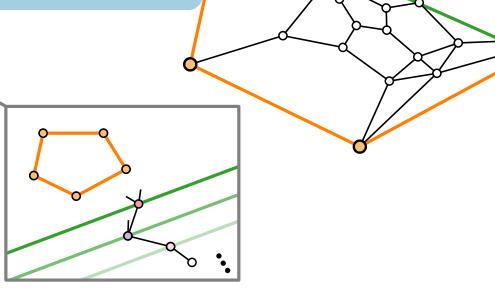
Properties of Tutte Drawings

Property 1. Let $v \in V$ free, ℓ line through v.

 $\exists uv \in E$ on one side of $\ell \Rightarrow \exists vw \in E$ on other side

Otherwise, all forces to same side . . .

Property 2. All free vertices lie inside *C*.



Properties of Tutte Drawings

Property 1. Let $v \in V$ free, ℓ line through v.

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Property 2. All free vertices lie inside *C*.

Property 3. Let ℓ be any line.

Let V_{ℓ} be all vertices on one side of ℓ . Then $G[V_{\ell}]$ is connected.

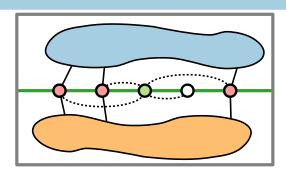
v furthest away from ℓ

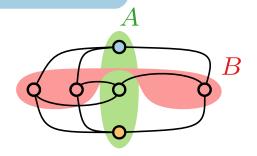
Pick any vertex u, ℓ' parallel to ℓ through u

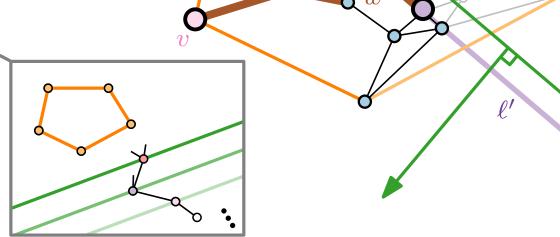
G connected, v not on $\ell'\Rightarrow \exists w$ on ℓ' with neighbor further away from $\ell\Rightarrow \exists$ path from u to v

Property 4. No vertex is collinear with all of its neighbors.

Not all vertices collinear G 3-connected $\Rightarrow K_{3,3}$ minor







Proof of Tutte's Theorem

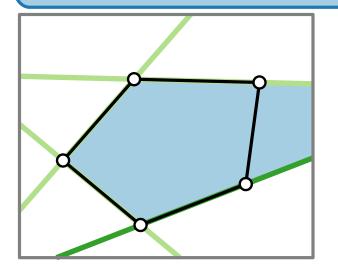
Lemma. Let uv be a non-boundary edge, ℓ line through uv. Then the two faces f_1, f_2 incident to uv lie completely on opposite sides of ℓ .

Property 1. Let $v \in V$ free, ℓ line through v. $\exists uv \in E$ on one side of $\ell \Rightarrow \exists vw \in E$ on other side

Property 3. Let ℓ be any line. Let V_{ℓ} be the set of vertices on one side of ℓ . Then $G[V_{\ell}]$ is connected.

Property 4. No vertex is collinear with all of its neighbors.

Lemma. All faces are strictly convex.

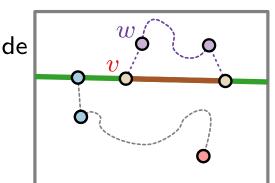


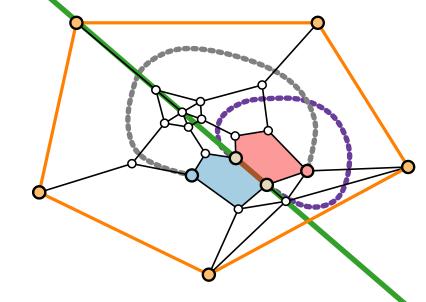
p inside two faces Property 2. All free vertices lie inside C.

 $\Rightarrow q$ in one face jumping over edge

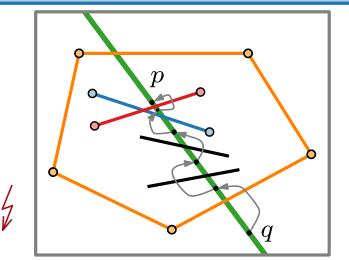
 \rightarrow #faces the same

 $\Rightarrow p$ inside one face





Lemma. The drawing is planar.



Literature

Main sources:

- [GD Ch. 10] Force-Directed Methods
- [DG Ch. 4] Drawing on Physical Analogies

Original papers:

- [Eades 1984] A heuristic for graph drawing
- [Fruchterman, Reingold 1991] Graph drawing by force-directed placement
- [Tutte 1963] How to draw a graph