# Grandalf: A Python module for Graph Drawings

https://github.com/bdcht/grandalf

Axel Tillequin Bibliography on Graph Drawings - 2008-2010

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#### Outline

- Graphs generalities
  - Motivations
  - Definitions
  - Graph Drawing Principles
- Sugiyama Hierarchical Layout
  - 1. Layering
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  - 3. x-coordinate assignment
  - 4. y-coordinate assignment
- Force-driven Hierarchical Layout
  - Energy minimization
  - Hierarchical layer constraints
  - Quadratic Programming with Orthogonal Constraints

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#### Motivations

**Interactive** drawing of an evolutionary *hierarchical graph* ?

Application: browsing the flow graph of a malware

- identifying/viewing/folding procedures by semantic analysis
- visualizing properties at some points in the program

#### Needs

Interactive/adaptative drawings of small 2D directed graphs ( $|V|\approx 100$ ): allowing node contraction (folding), and layout updating without entire recomputation !

→ Grandalf : small Python module for experimental Graph layout testings

## **Existing Tools**

see [1]

- program flow browsers:
  - ► IDA, BinNavi: good interfaces but fails at semantic-driven analysis,
- graph drawings:
  - general-purpose, 2D:
    - graphviz (open source, C),
    - ★ OGDF (GPL, C++), PIGALE (GPL, C++), GUESS, ...
    - \* GDToolkit (commercial, C++), yFiles (commercial, Java)
  - ► Huge graphs, 2D: Tulip (GPL, C++),
  - Huge graphs, 3D: OGDF, Walrus (GPL, Java).



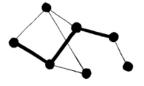




## Graph theory basics

#### Definition

A Graph is a pair G = (V, E) of sets such that  $E \subset V^2$ .

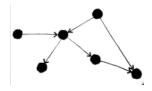


- ullet V are vertices (nodes, points), and E are edges (lines, segments)
- $\bullet$   $v \in V$  has neighbours (adjacent nodes)
- a path P is a subgraph of distinct nodes  $v_0, ..., v_k$  s.t  $(v_i, v_{i+1}) \in E$ .
- G has k-connected components: for all  $v_i, v_j \in V$ ,  $\exists k$  paths.

## Graph theory basics

#### Properties:

- A graph *G* is **directed** if one can distinguish initial/terminal nodes for an edge. *G* is **hierarchical** if it has also a rooted tree *T*.
- A graph *G* is **acyclic** if no path are closed. Then *G* is a forest, its components are trees.
- A graph is planar if it can be drawn on a plane with no edge crossing.



→ minimize edge-crossing for non-planar graphs!

## Graph Drawing Principles

#### for all graphs:

#### Drawing Rules

Many static/dynamic, semantic/structural rules:

- avoiding node overlapping,
- minimizing edge crossing, minimize total edge length
- favor straight line placement, avoid edge bends,
- use hierarchical information,
- balance width/height,
- show symmetries,

⇒ link with many NP-complete problems

### Layouts and Methods

Hierarchical vs. undirected layouts:

Undirected graphs: 2D or 3D, can be of huge sizes, focusing mainly on connectivity so that force-driven (energy minimization) methods give good drawings.

Hierarchical graphs: mostly 2D (or 2.5D) graphs for which edge directions provide a natural global orientation of the graph from a top root node down to leaves.

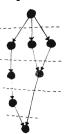
#### Methods and Solvers

- heuristics algorithms
  - ⇒ efficient but not suited to user-defined constraints
- Constraint based solvers
  - ⇒ inefficient but depend on constraints expressions only

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## 1. Layering

- $L = (L_1, ..., L_h)$ , ordered partition of V into layers  $L_i$ .
  - ullet directed acyclic graph:  $\Longrightarrow$  cycle removal algorithm
  - simple "natural" layering: put top nodes (no "in" edges) in queue,



ullet add "dummy" nodes for edges that span over several layers minimum total edge length  $\Longrightarrow$  simplex solver

## 2. Ordering

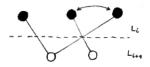
see [3]

Global ordering decomposed into iterated 2-layers ordering:

#### 2-layers ordering

optimal edge crossing is NP ! but many heuristics for approx. solutions by fixing  $L_i$  and ordering  $L_{i\pm 1}$ :

- **position** of  $v_j$  depend on upper/lower neighbours (median, barycenter)
- count all crossings and exchange accordingly.



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## 3. x-coordinate assignment

see [3, 1]

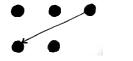
ordering  $\neq$  horizontal assignment:

 $\Longrightarrow$  need to guarantee vertical inner segments, fair balance etc.

#### Horizontal alignment

minimize  $\sum_{e=(u,v)\in E} w(e)|u.x-v.x|$  subject to minimum separation

- select edges that influence alignment
- perform 4 vertical alignments with median heuristic:
  - upper/left, upper/right alignement
  - ► lower/left, lower/right alignement







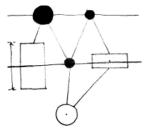
sort 4 coords and set v.x to barycenter of medians

## 4. y-coordinate assignment

#### What about Node size?

Previous heuristics assume all nodes have same size, avoiding edge routing problems...

- height of layer L<sub>i</sub> set to max height of its nodes...simple but not optimal!
- other heuristics exists[2]...more heuristics on heuristics...



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### **Energy minimization**

see [4, 5]

introduced in 1989 by Kamada&Kawai for undirected graph G = (V, E). The idea is to minimize:

$$\sigma(X) = \sum_{i < j} w_{ij} (\|X_i - X_j\| - d_{ij})^2$$

where  $X_i = (v_i.x, v_i.y)$ ,  $d_{ij}$  is the *ideal* distance between node  $v_i$  and  $v_j$  (ie. graph distance), and  $w_{ij} = 1/d_{ij}^2$  is a normalization coefficient.

Note that,  $\sum_{i < j} w_{ij} ||X_i - X_j||^2 = Tr(X^t \cdot L^w \cdot X)$  with  $L^w$  the weighted Laplacian

matrix of 
$$G: L_{ij}^{w} = \begin{cases} \sum_{i \neq k} w_{ik}, & i = j \\ -w_{ij}, & i \neq j \end{cases}$$
 s.t we have:

$$\sigma(X) \le Cst + Tr(X^t \cdot L^w \cdot X) - 2Tr(X^t \cdot L^{wd/Z} \cdot Z)$$
$$\partial F^Z(X) = 0 \Longrightarrow L^w \cdot X = L^{wd/Z} \cdot Z$$

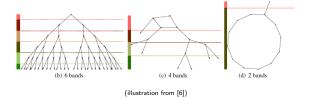
# Hierarchical contrained Energy

see [6]

hierarchical energy: take  $w_{ij}=1$  and  $\delta_{ij}=v_i.y-v_j.y$  (1 if  $(v_i,v_j)\in E$ ), a partition of V is given by minimizing  $E(Y)=\frac{1}{2}\sum_{i,j}w_{ij}(y_i-y_j-\delta_{ij})^2$ 

$$\Longrightarrow L^w Y = b, \quad (Y \cdot 1 = 0)$$

with  $b_i = \sum_j w_{ij} \delta_{ij}$ .



 $L^w$  is semi-definite positive  $\Longrightarrow$  Conjugated gradient O(n) iterations.

# Quadratic Programming with Orthogonal Constraints see [6, 5]

minimize  $\sigma(X)$ , subject to contraints :

$$\forall v_j \in level(i): v_j.y \geq l_i, i = 1,...,k$$

$$\forall v_j \in level(i+1): v_j.y + \Delta l \leq l_i, i = 1,...,k$$



- gradient descent  $(\tilde{X}_{k+1} = \min_X F^{X_k}(X))$
- ullet projection to levels  $\Pi( ilde{X}_{k+1}) = \hat{X}_{k+1}$
- $\bullet \text{ set } X_{k+1} = X_k + \alpha (\hat{X}_{k+1} X_k)$

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