### Spectral Graph Drawing

Rodrigo Arias

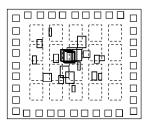
January 21, 2018

#### Outline

- Background
- ► Motivation
- ▶ Ideas from the paper
- ► Methods
- Examples
- ► Conclusions

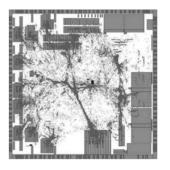
### Background

The placement problem.



- Analytic solution: Minimize an **objective function** (wire, area...) via mathematical analysis.
- Global placement must be legalized afterwards (detailed placement).

#### Motivation



- ▶ Cells and nets can be modeled as an undirected graph
- ▶ Spectral methods can be used to draw complex graphs

#### Ideas from the paper

In the Koren paper [1] two methods to find the placement of the nodes are described, using the following properties.

- ightharpoonup Method 1: The Laplacian matrix L
- $\triangleright$  Method 2: The normalized Laplacian matrix  $\mathcal{L}$

The methods minimize the total wire-length

## Method 1: Laplacian matrix L

► A graph can be represented by the adjacency matrix *A*, were

$$a_{ij} = \begin{cases} 1 & \text{if } i \text{ and } j \text{ are connected} \\ 0 & \text{otherwise} \end{cases}$$

- ▶ Also, the degree matrix D has the degree of each node in the diagonal,  $d_{ii} = deg(i)$ .
- ▶ Finally the Laplacian matrix is defined as L = D A

### Method 1: Laplacian matrix L

► The problem is formulated as the minimization of the square wire-length

$$\min_{x} E(x) = \sum_{x} (x(i) - x(j))^{2}$$
s.t.  $Var(x) = 1$  (1)

- ▶ The eigenvalues  $\lambda_1 \leq \lambda_2 \cdots \lambda_m$  and eigenvectors  $v_1, v_2, \cdots v_m$  of L are computed.
- ▶ The positions of the nodes are given by the coordinates of  $x = v_2$  and  $y = v_3$ .

### Method 2: Normalized Laplacian matrix

Let  $d_i$  be the degree of the node i, we define the normalized Laplacian matrix  $\mathcal{L}$  as:

$$\mathcal{L}(i,j) = \begin{cases} 1 & \text{if } i = j, \text{ and } d_i \neq 0 \\ -\frac{1}{\sqrt{d_i d_j}} & \text{if } i \text{ and } j \text{ are connected} \\ 0 & \text{otherwise} \end{cases}$$

▶ We give more weight to the nodes with higher degree, in order to cluster neighbours around centric nodes.

### Method 2: Normalized Laplacian matrix

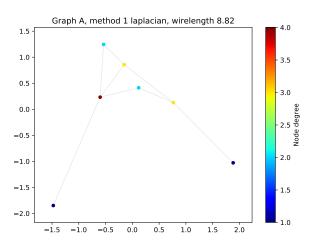
- ▶ The solution is computed as before, but now using the matrix  $\mathcal{L}$ .
- ► The eigenvalues  $\lambda_1 \leq \lambda_2 \cdots \lambda_m$  and eigenvectors  $v_1, v_2, \cdots v_m$  of  $\mathcal{L}$  are computed.
- ▶ The positions of the nodes are given by the coordinates of  $x = v_2$  and  $y = v_3$ .

#### Examples

In order to test the methods, some graphs were generated

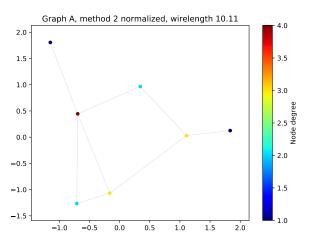
- ► Small graph crafted by hand with 7 nodes.
- ► Erdös-Rényi graph with 100 nodes
- ► A FPGA network from a real Verilog TX module with 345 nodes

## Small graph



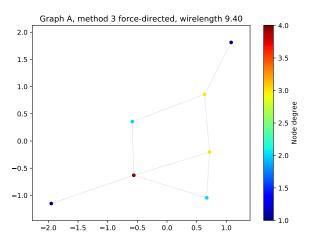
Using the method 1, the Laplacian matrix L. Wire-length: 8.82

## Small graph



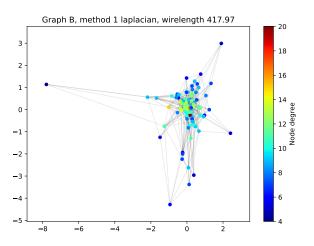
Using the method 2, the normalized Laplacian matrix  $\mathcal{L}$ . Wire-length: 12.87

## Small graph



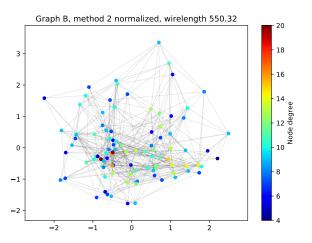
Using the directed force method (for comparison). Wire-length: 9.40

## ER graph



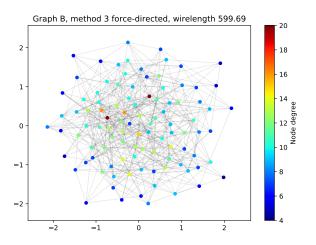
Using the method 1, the Laplacian matrix L. Wire-length: 417.97

## ER graph



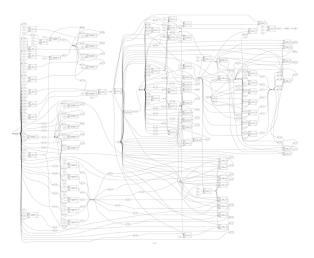
Using the method 2, the normalized Laplacian matrix  $\mathcal{L}$ . Wire-length: 722.86

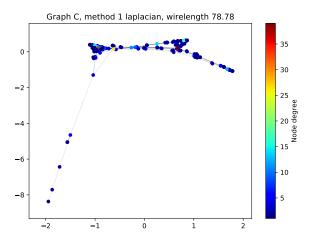
# ER graph



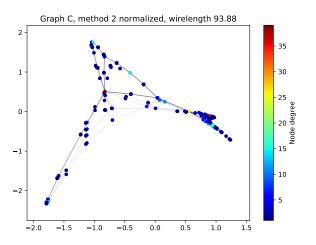
Using the spring method (for comparison). Wire-length: 599.69

Generated using Yosys [2] from the Verilog file uart\_trx.v.

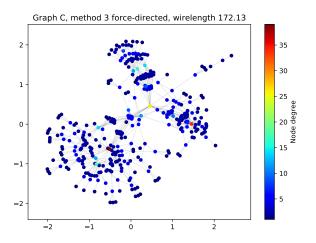




Using the method 1, the Laplacian matrix L. Wire-length: 78.78



Using the method 2, the normalized Laplacian matrix  $\mathcal{L}$ . Wire-length: 733.78



Using the spring method (for comparison). Wire-length: 172.13

#### Observations

- ► The proposed model doesn't take into account the size of the cells
- ▶ Multiple cells can overlap in the same point
- ▶ The behavior is not close to reality

#### Conclusions

- ► The spectral methods can be used in the global placement.
- ▶ Don't produce great results in comparison with spring layout.
- ► The underlying working principle is complex to understand.
- ▶ May be suitable for larger graphs, as the matrices are usually very sparse.

#### References

- Yehuda Koren On Spectral Graph Drawing
  Proceedings of the 9th Annual International Conference
  on Computing and Combinatorics, p496–508, 2003.
  - Clifford Wolf, Johann Glaser. Yosys A Free Verilog Synthesis Suite. In Proceedings of Austrochip 2013