

# ***d*-dimensional arrangement revisited**

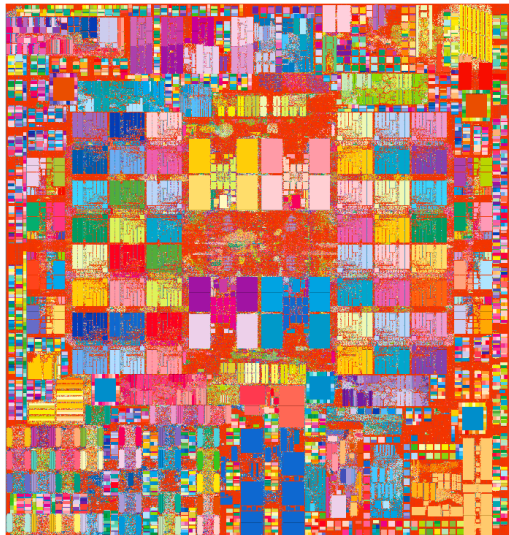
**Jens Vygen**

University of Bonn

(joint work with Daniel Rotter)

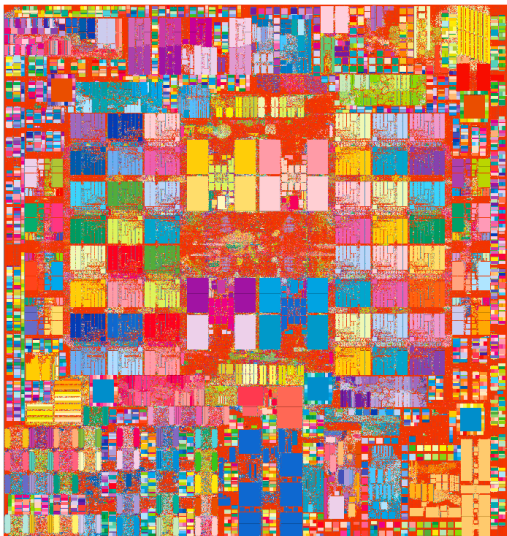
April 16, 2013

# Chip design



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## Placement Problem:

Given

a (large) set of rectangular objects with pins,  
a rectangular chip area,  
fixed objects and/or pins,  
and a partition of the set of pins into nets;

place the objects within the chip area without overlaps such that  
“the pins of every net are close to each other”

# Chip design



THE CHALLENGE: DETERMINE  $M_1, M_2, M_3, M_4, M_5, M_6, M_7, M_8, M_9, M_{10}, M_{11}, M_{12}, M_{13}, M_{14}, M_{15}, M_{16}, M_{17}, M_{18}, M_{19}, M_{20}, M_{21}, M_{22}, M_{23}, M_{24}, M_{25}, M_{26}, M_{27}, M_{28}, M_{29}, M_{30}, M_{31}, M_{32}, M_{33}, M_{34}, M_{35}, M_{36}, M_{37}, M_{38}, M_{39}, M_{40}, M_{41}, M_{42}, M_{43}, M_{44}, M_{45}, M_{46}, M_{47}, M_{48}, M_{49}, M_{50}, M_{51}, M_{52}, M_{53}, M_{54}, M_{55}, M_{56}, M_{57}, M_{58}, M_{59}, M_{60}, M_{61}, M_{62}, M_{63}, M_{64}, M_{65}, M_{66}, M_{67}, M_{68}, M_{69}, M_{70}, M_{71}, M_{72}, M_{73}, M_{74}, M_{75}, M_{76}, M_{77}, M_{78}, M_{79}, M_{80}, M_{81}, M_{82}, M_{83}, M_{84}, M_{85}, M_{86}, M_{87}, M_{88}, M_{89}, M_{90}, M_{91}, M_{92}, M_{93}, M_{94}, M_{95}, M_{96}, M_{97}, M_{98}, M_{99}, M_{100}$ ...

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place the objects within the chip area without overlaps such that “the pins of every net are close to each other”

**Simplifications:** all objects are unit squares with pins in the center, each net has two pins, no fixed objects/pins, measure total  $\ell_1$ -length

## Models with polylogarithmic approximation algorithms

- ▶ **Vempala [1998]**: minimize total length and maximum edge length,  $O(\log^{3.5} n)$ -approximation
- ▶ **Even, Guha, Schieber [2000]**: embed edges by edge-disjoint paths, minimize area,  $O(\log^4 n)$ -approximation

where  $n$  is the number of objects that are to be placed.

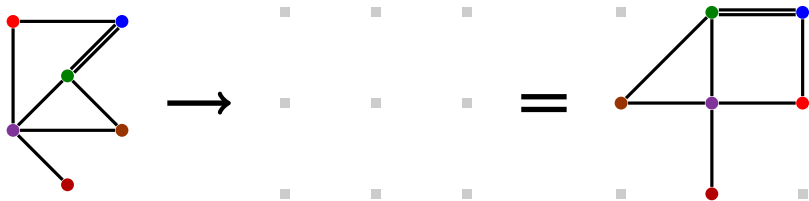
In the following:

- ▶ 2-dimensional arrangement: minimize total length only

## $d$ -dimensional arrangement problem

**Given:** undirected graph  $G = (V, E)$  and  $k \geq \sqrt[d]{|V|}$

**Find:** injection  $p: V \rightarrow \{1, \dots, k\}^d$  minimizing  $\sum_{\{v,w\} \in E} \|\rho(v) - \rho(w)\|_1$



- ▶  $d = 1$ : linear arrangement problem
- ▶  $d = 2$ : interesting model of placement in chip design
- ▶ this talk:  $d \geq 2$  fixed; unit weights, but all results generalize to weighted version (given edge weights, take weighted sum)

## Approximation algorithms for $d$ -dimensional arrangement

**Given:** undirected graph  $G = (V, E)$  and  $k \geq \sqrt[d]{|V|}$

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- ▶  $d = 1$ : linear arrangement problem
  - ▶ *NP*-hard: [Garey, Johnson \[1976\]](#)
  - ▶  $O(\sqrt{\log n \log n})$ -approximation: [Feige, Lee \[2007\]](#) and independently [Charikar, Hajiaghayi, Karloff, Rao \[2010\]](#), improving on [Rao, Richa \[2004\]](#)

Here  $n = |V|$ .

## Approximation algorithms for $d$ -dimensional arrangement

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- ▶  $d \geq 2$  (fixed):
  - ▶ sketch of  $O(\log^2 n)$ -approximation by recursive bipartitioning: [Hansen \[1989\]](#), using [Leighton, Rao \[1999\]](#)
  - ▶ can lead to  $O(\log^{3/2} n)$ -approximation when using [Arora, Rao, Vazirani \[2009\]](#)

Here  $n = |V|$ .



## Reduction to linear arrangement with “ $d$ -dimensional cost”

$$\min \left\{ \sum_{\{v,w\} \in E} \sqrt[d]{|p(v) - p(w)|} \mid p : V \rightarrow \{1, \dots, n\} \text{ bijective} \right\}$$

- ▶ reduction proposed by [Even, Naor, Rao, Schieber \[2000\]](#)
- ▶  $O(\log n \log \log n)$ -approximation for this problem by [Even et al. \[2000\]](#)
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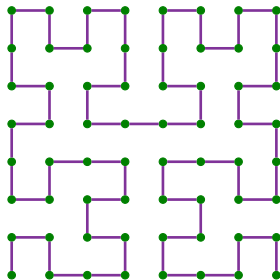
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Unfortunately, this does **not** imply the same approximation ratios for  $d$ -dimensional arrangement!

## Reduction to linear arrangement with $d$ -dimensional cost

### Lemma

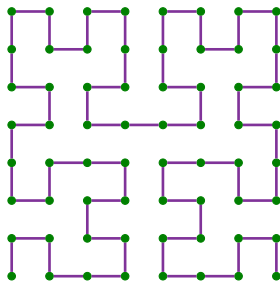
Using Hilbert's space-filling curve, we can find an injection  $p : \{1, \dots, n\} \rightarrow \{1, \dots, k\}^d$  such that  $\|p(i) - p(j)\|_1 \leq 4(d+1) \sqrt[d]{|i-j|}$  for all  $i, j$ .



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### Corollary

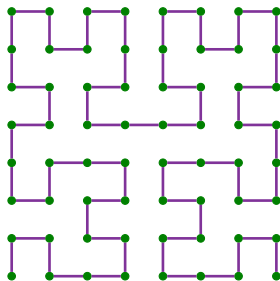
Given a linear arrangement of  $G$  with  $d$ -dimensional cost  $\gamma$ , we can compute a  $d$ -dimensional arrangement of  $G$  with cost  $O(\gamma)$ .

(Even, Naor, Rao, Schieber [2000])

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However,  
the optimum  $d$ -dimensional cost for a linear arrangement can be much larger than the optimum cost of a  $d$ -dimensional arrangement.

## How good is the reduction?

### Theorem

For any graph  $G = (V, E)$  and any injection  $p : V \rightarrow \{1, \dots, k\}^d$ , there exists a bijection  $q : V \rightarrow \{1, \dots, n\}$  such that

$$\sum_{\{v,w\} \in E} \sqrt[d]{|q(v) - q(w)|} \leq O(\log n) \sum_{\{v,w\} \in E} \|p(v) - p(w)\|_1.$$

There are pairs  $(G, p)$  for which this bound is tight.

Therefore a factor  $O(\log n)$  is lost in this reduction!

## Upper bound

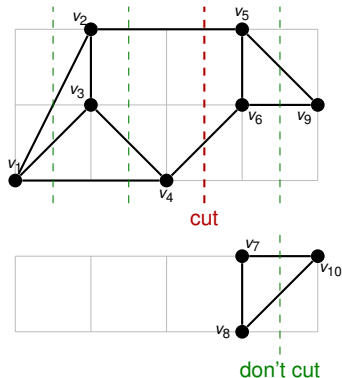
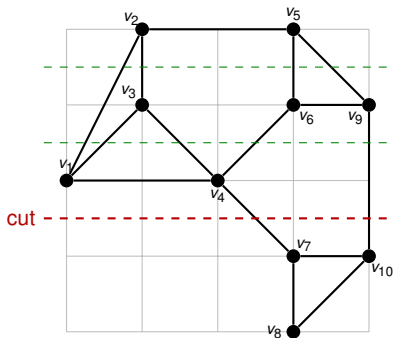
### Lemma

*For any graph  $G = (V, E)$  and any injection  $p : V \rightarrow \{1, \dots, k\}^d$  (where  $k, d \in \mathbb{N}$ ), there exists a bijection  $q : V \rightarrow \{1, \dots, n\}$  such that*

$$\sum_{\{v,w\} \in E} \sqrt[d]{|q(v) - q(w)|} \leq 32d \ln n \sum_{\{v,w\} \in E} \|p(v) - p(w)\|_1.$$

## Proof of upper bound (sketch)

- ▶ Consider cut coordinates with enough vertices on both sides
- ▶ If sufficiently many such coordinates exist, take smallest cut
- ▶ Continue with next dimension until each set is a singleton



Yields balanced hierarchical decomposition; order vertices accordingly



## Lower bound

Consider the  $d$ -dimensional hypercube graph  $(V_k^d, E_k^d)$ :

- ▶  $V_k^d = \{1, \dots, k\}^d$
- ▶  $E_k^d = \{\{x, y\} : x, y \in V_k^d, \|x - y\|_1 = 1\}$

The identity function is a  $d$ -dimensional arrangement of cost

$$\sum_{\{v, w\} \in E_k^d} \|v - w\|_1 = |E_k^d| = d(k^d - k^{d-1}) < dn.$$

## Lemma

Let  $d \geq 2$ . If  $q : V_k^d \rightarrow \{1, \dots, n\}$  is any bijection, then

$$\sum_{\{v, w\} \in E_k^d} \sqrt[d]{|q(v) - q(w)|} >$$

$$\frac{3}{16} \left(1 - \left(\frac{3}{4}\right)^{\frac{d-1}{d}}\right) \left(1 - \left(\frac{3}{4}\right)^{1/d}\right) d n \log_2 n - \frac{3dn}{64}.$$

## Spreading LP

$$\begin{aligned} \min \quad & \sum_{e=\{v,w\} \in E} l(v,w) \\ \text{s.t.} \quad & l(v,w) = l(w,v) \geq 0 && (v,w \in V) \\ & l(u,v) + l(v,w) \geq l(u,w) && (u,v,w \in V) \\ & \sum_{u \in U} l(u,v) \geq \frac{(|U| - 1)^{1+1/d}}{4} && (U \subseteq V, v \in U) \end{aligned}$$

- ▶ Can be solved in polynomial time  
(Even, Naor, Rao, Schieber [2000], Bornstein, Vempala [2004])

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- ▶ Can be solved in polynomial time  
(Even, Naor, Rao, Schieber [2000], Bornstein, Vempala [2004])
- ▶ LP value is a lower bound on the optimum cost of a  $d$ -dimensional arrangement (Even [2011])
- ▶ Implies that the Even-Naor-Rao-Schieber algorithm is indeed an  $O(\log n \log \log n)$ -approximation algorithm

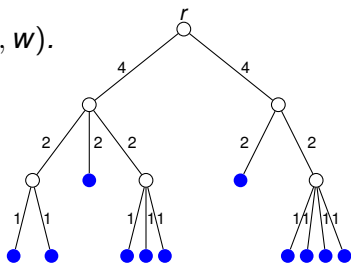
## Approximating any metric by a tree metric

### Lemma (Fakcharoenphol, Rao and Talwar [2004])

Let  $G = (V, E)$  be a graph,  $n = |V| \geq 2$ , and  $l : V \times V$  a metric. Then one can compute in polynomial time a 2-hierarchically well-separated tree  $(T, r, c)$  such that  $V$  is the set of leaves of  $T$ , and the induced tree metric  $l'$  satisfies:

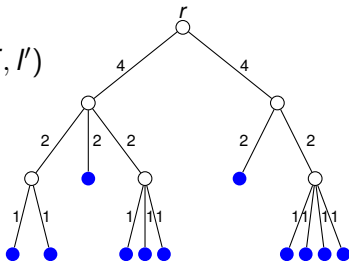
(a)  $l'(v, w) \geq l(v, w)$  for all  $v, w \in V$ , and

(b)  $\sum_{\{v,w\} \in E} l'(v, w) \leq O(\log n) \sum_{\{v,w\} \in E} l(v, w)$ .



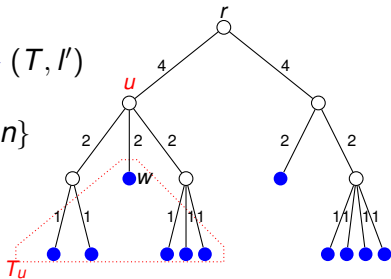
## $O(\log n)$ -approximation algorithm for $d$ -dimensional arrangement

- ▶ Solve spreading LP  $\rightarrow l$
- ▶ Approximate  $l$  by tree metric  $\rightarrow (T, l')$
- ▶ Order of the leaves of  $T$  in the natural way  $\rightarrow q: V \rightarrow \{1, \dots, n\}$
- ▶ Arrange the vertices according to the Hilbert curve lemma.



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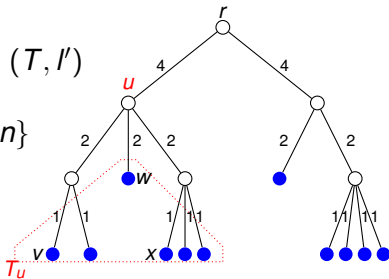


### Proof of approximation ratio:

- ▶ Let  $\{v, w\} \in E$  and  $u$  the nearest common ancestor of  $v$  and  $w$ .

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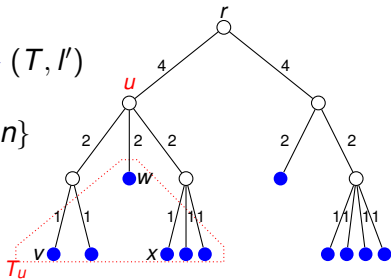


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- ▶ Let  $\{v, w\} \in E$  and  $u$  the nearest common ancestor of  $v$  and  $w$ .
- ▶ Due to the spreading constraints, there is an  $x \in T_u$  such that  $l(v, x) \geq \frac{1}{4} \sqrt[d]{|T_u| - 1}$ .

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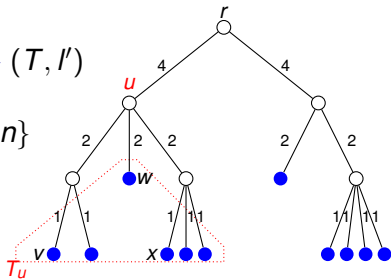
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$$\sqrt[d]{|q(v) - q(w)|} \leq \sqrt[d]{|T_u|} - 1 \leq 4l(v, x) \leq 4l'(v, x) \leq 8l'(v, w).$$



## $O(\log n)$ -approximation algorithm for $d$ -dimensional arrangement

- ▶ Solve spreading LP  $\rightarrow I$
- ▶ Approximate  $I$  by tree metric  $\rightarrow (T, I')$
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$$\sqrt[d]{|q(v) - q(w)|} \leq \sqrt[d]{|T_u|} - 1 \leq 4 I(v, x) \leq 4 I'(v, x) \leq 8 I'(v, w).$$

- ▶ Hence,

$$\sum_{\{v, w\} \in E} \sqrt[d]{|q(v) - q(w)|} \leq 8 \sum_{\{v, w\} \in E} I'(v, w) \leq O(\log n) \sum_{\{v, w\} \in E} I(v, w).$$



## Discussion

Currently best approximation algorithm (see above)

- ▶ finds a “high-dimensional embedding” (spreading metric),
- ▶ approximates it by a tree metric (by recursive bipartitioning),
- ▶ makes it a linear order,
- ▶ makes it  $d$ -dimensional via a space-filling curve.

Poly-time but very slow. No fixed pins etc.  $O(\log n)$ -approximation

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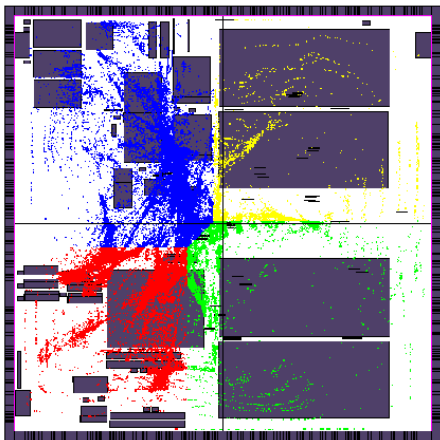
Some of the best heuristics in practice ( $d = 2$ ) proceed as follows (e.g., [BonnPlace](#), [Brenner, Struzyna, Vygen \[2008\]](#)):

- ▶ finds a 2-dimensional embedding (quadratic placement)
- ▶ uses recursive quadrisection ([Vygen \[2005\]](#))
- ▶ concludes with legalization ([Brenner, Vygen \[2004\]](#))

Fast. Needs fixed pins for “spreading”. No approximation guarantee

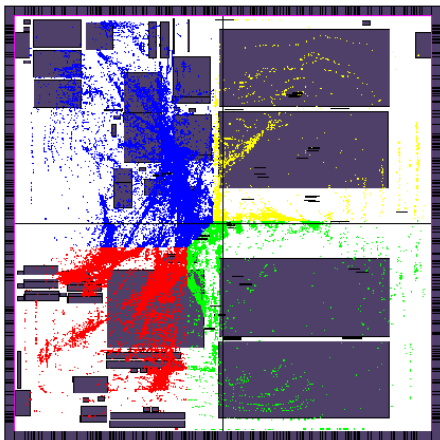
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- ▶ Improve approximation guarantee (or prove hardness)
- ▶ Obtain  $O(\log n)$ -approximation without spreading LP
- ▶ Generalize to practically more relevant problems
- ▶ Prove approximation guarantee for a practical algorithm