

A survey on discrete tomography

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Applications of Tomography

- **given:** 3 dimensional object
- **input:** several 2 dimensional projections
- **output:** 3D model of the object

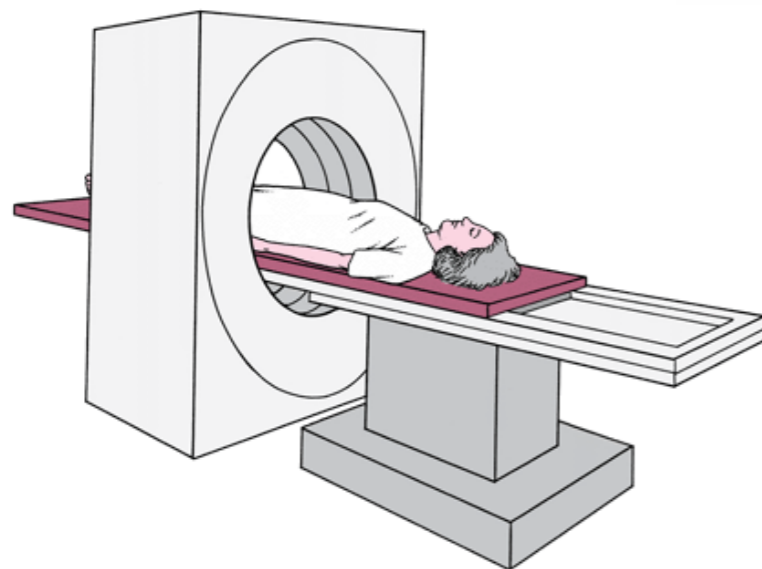
discrete tomography

few projections
object has discrete nature
(pixelized)

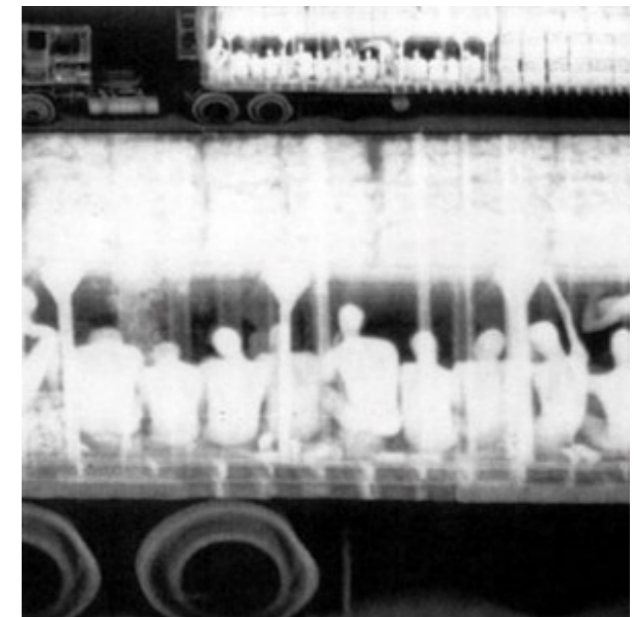
Larry Shepp 1994



non destructive
quality control in
manufacturing



medical application



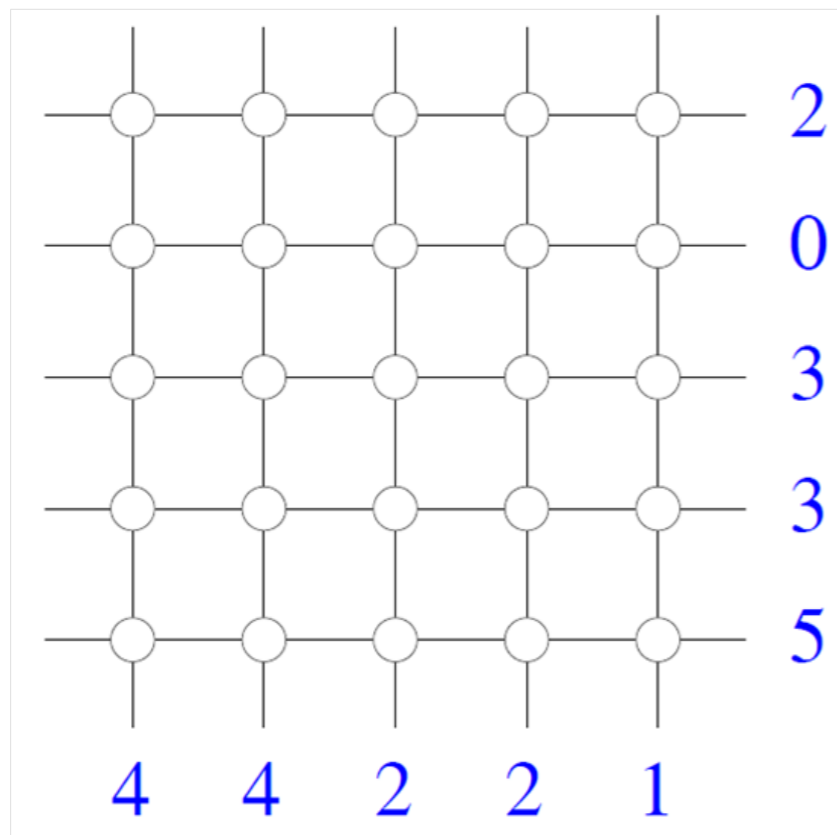
smuggle detection

Outline

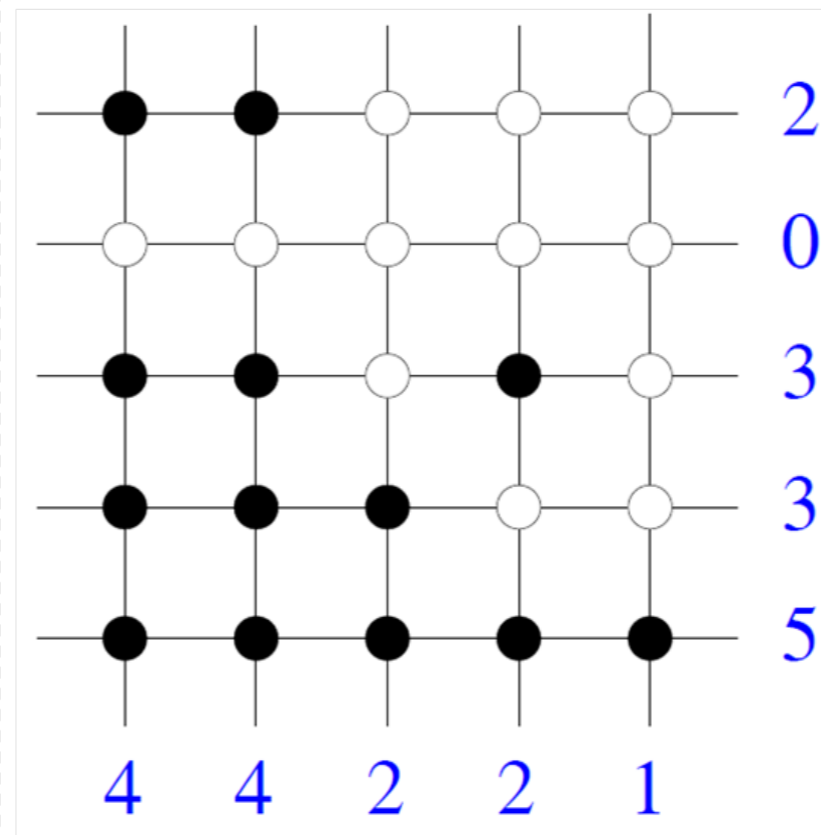
- Ryser's theorem
- a reduction to 2SAT
- reconstructing domino tilings

A basic problem

input



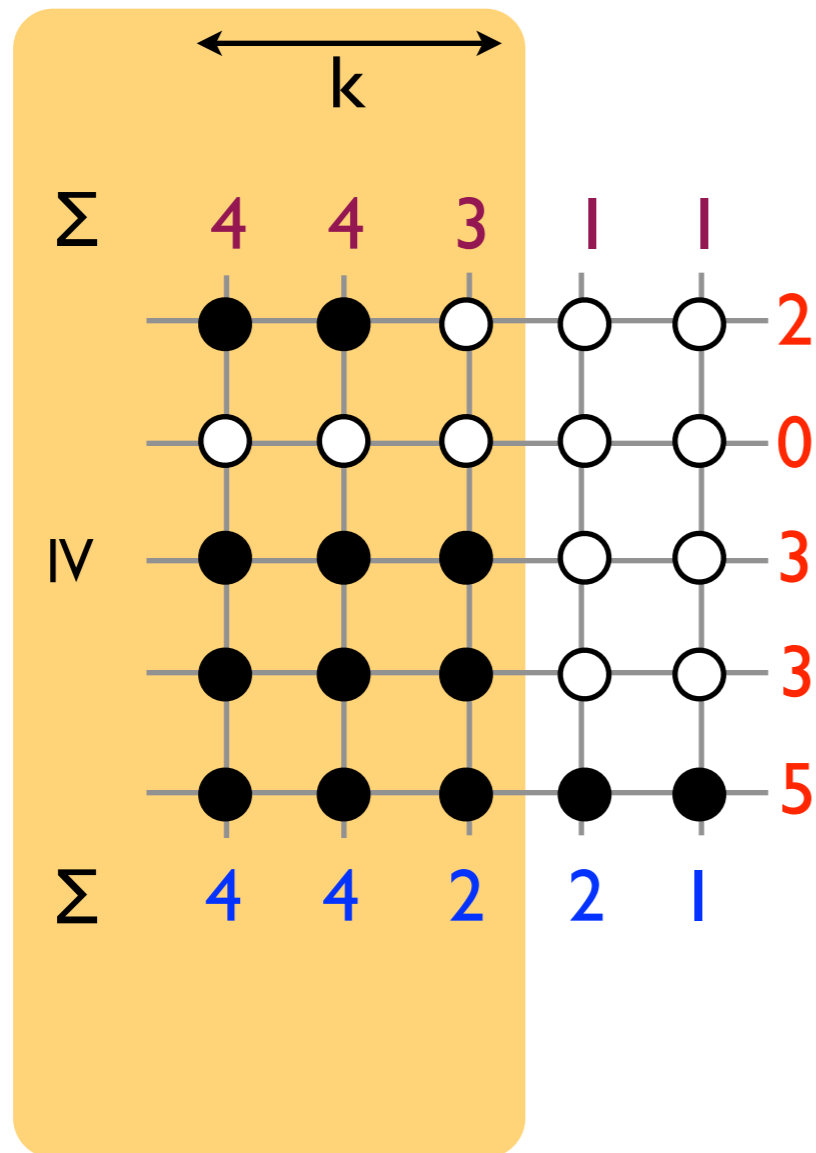
output



can be solved in polynomial time [Ryser'57]

- for every row (in any order), place the required number of pebbles always in a column with maximal remaining requirement
- is a transportation problem in complete bi-partite graph with unit capacities
- is a bi-partite matching problem
- has a solution iff *dual of column projections dominate row projections*

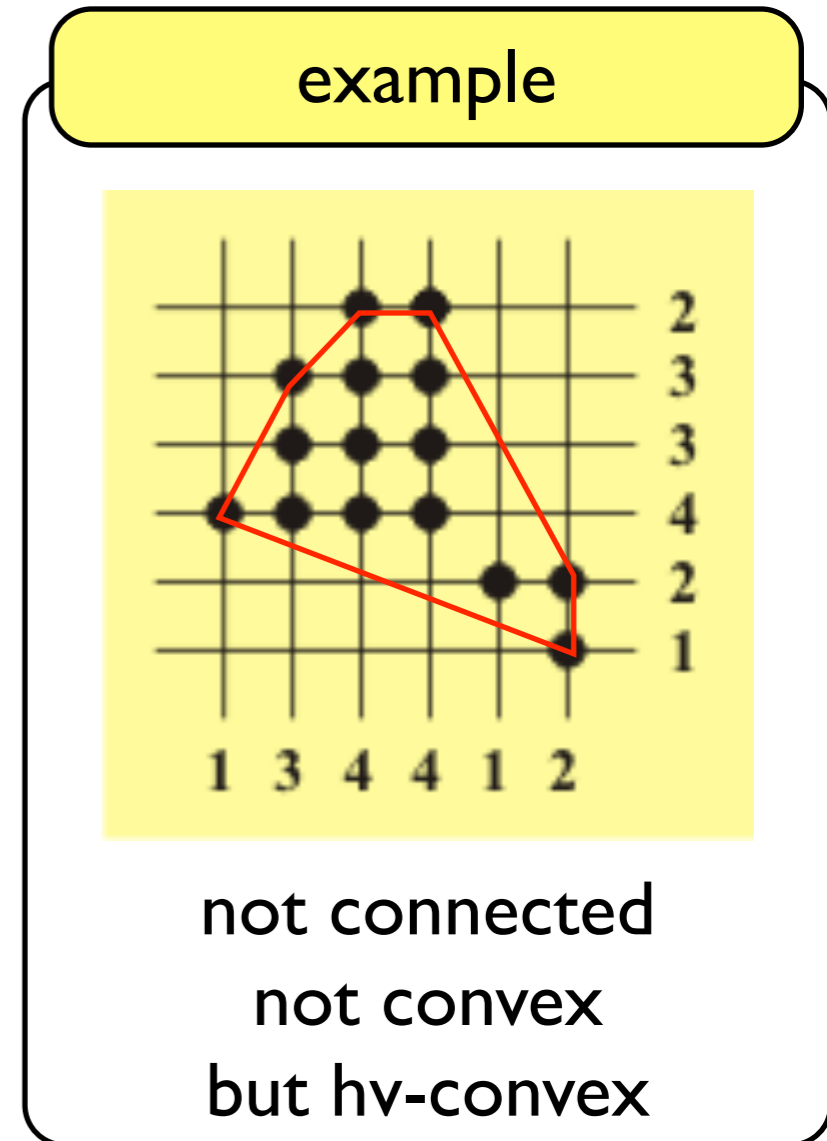
Ryser's theorem



- [Thm] there is a pebble placement with row projection r and column projection s iff the dual of r dominates s
- [Def] The dual of r is the column projection of the leftmost placement with row projection r
- [Def] The dual r^* dominates s if for every k , the prefix sums over $i=1 \dots k$ satisfy $\sum r^*_i \geq \sum s_i$
- [proof only if] r^* dominates the column proj of any placement with row proj. r
- [proof if] right shifting a pebble in the first column k with $\sum_{i=1}^k r^*_i > \sum_{i=1}^k s_i$ preserves dominance and makes vectors closer

adding convexity constraints

- In general solution is not unique
think: solutions to $(1, \dots, 1), (1, \dots, 1)$ are all permutation matrices
- So it makes sense to impose properties on solutions:
- **connected**: pebbles should form a connected set (4-neighborhood)
- **convex**: convex hull of pebbles should contain no empty cell
- weaker **hv-convex**: every row or column should contain a single contiguous sequence of pebbles

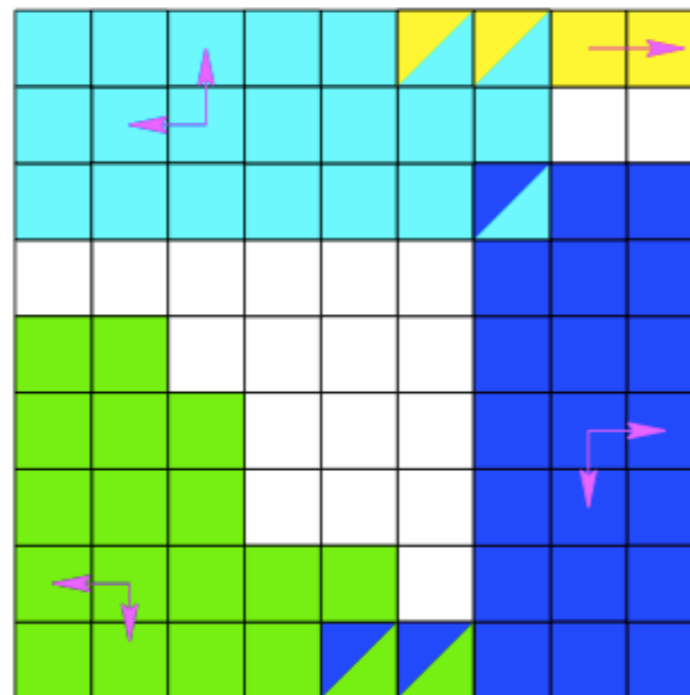


complexity status

	unconstrained	connected
unconstrained	polynomial [Ryser'57]	NP-complete [Woeginger'96]
hv-convex	NP-complete [Barcucci,delLungo,Nivat,Pinzani'96]	polynomial [Barcucci,delLungo,Nivat,Pinzani'96]
convex		polynomial [Brunetti,Daurat,Kuba'2006..08] (needs proj. from 4 dir)

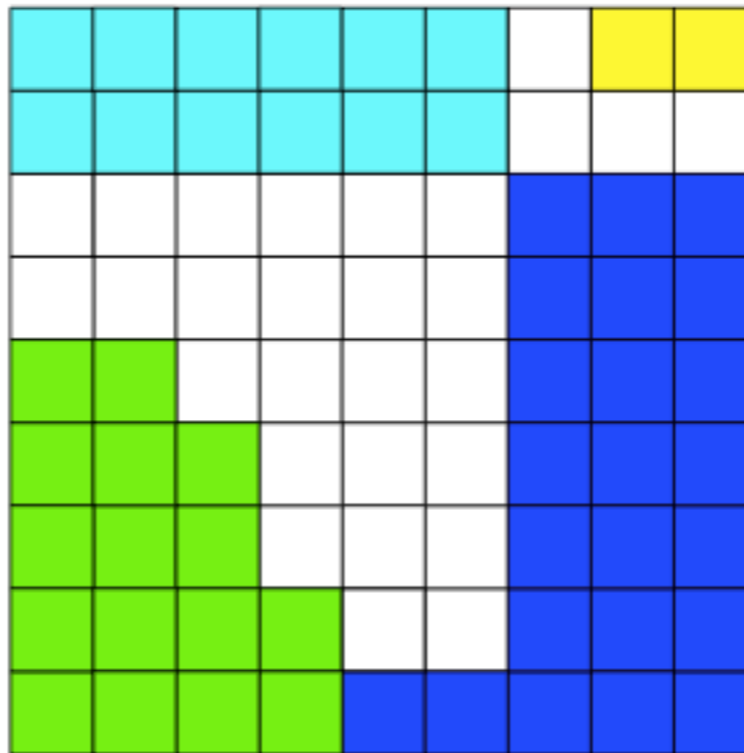
Impose set defined by A (B,C,D)
 corresponds to a corner region

$$Cor = \bigwedge_{i,j} \left\{ \begin{array}{ll} A_{i,j} \Rightarrow A_{i-1,j} & A_{i,j} \Rightarrow A_{i,j-1} \\ B_{i,j} \Rightarrow B_{i-1,j} & B_{i,j} \Rightarrow B_{i,j+1} \\ C_{i,j} \Rightarrow C_{i+1,j} & C_{i,j} \Rightarrow C_{i,j-1} \\ D_{i,j} \Rightarrow D_{i+1,j} & D_{i,j} \Rightarrow D_{i,j+1} \end{array} \right\}$$



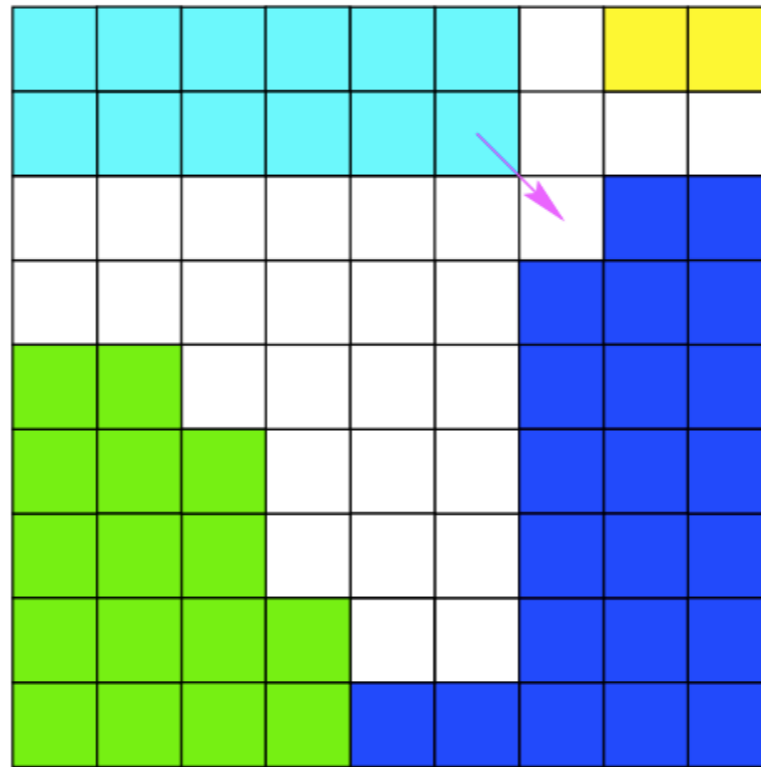
Make sure corners are disjoint

$$Dis = \bigwedge_{i,j} \{X_{i,j} \Rightarrow \bar{Y}_{i,j} : \text{for distinct symbols } X, Y \in \{A, B, C, D\}\}$$



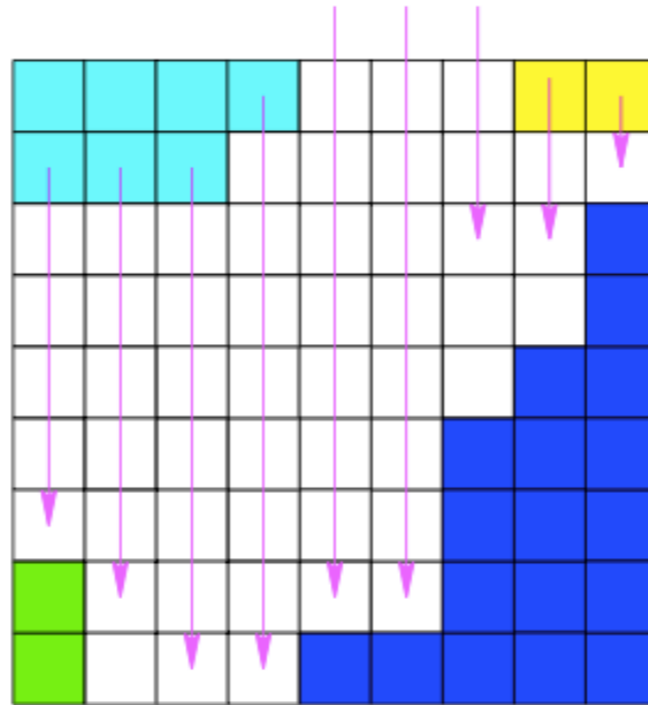
Make sure cells left by corners are connected

$$Con = \bigwedge_{i,j} \{ A_{i,j} \Rightarrow \overline{D}_{i+1,j+1} \quad B_{i,j} \Rightarrow \overline{C}_{i+1,j-1} \}$$



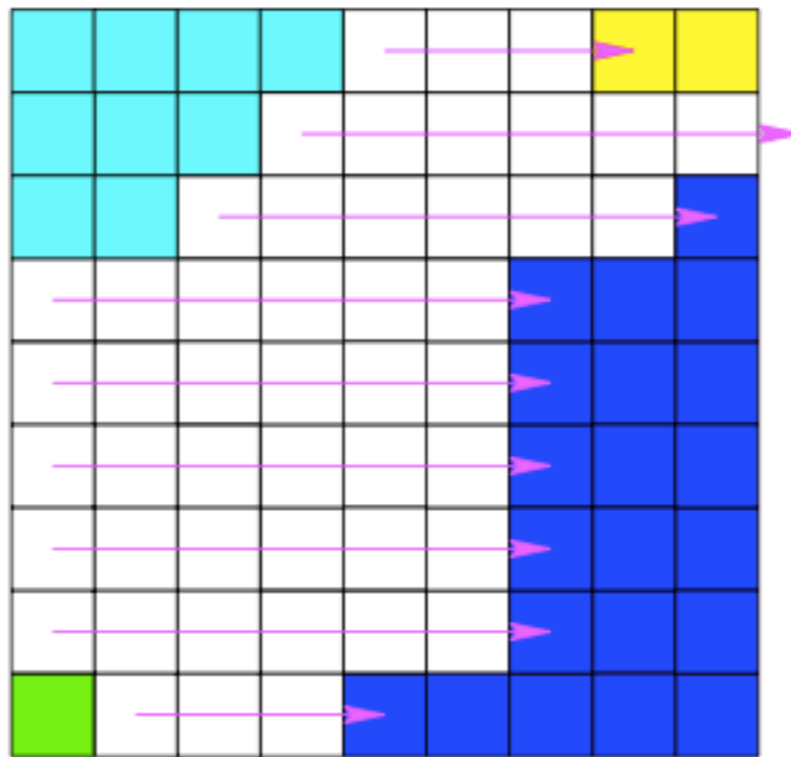
require column projections to be at least the given numbers

$$\begin{aligned}
 LBC &= \bigwedge_{i,j} \{ (A_{i,j} \vee B_{i,j}) \Rightarrow (\bar{C}_{i+c_j,j} \wedge \bar{D}_{i+c_j,j}) \} \wedge \bigwedge_j \{ \bar{C}_{c_j,j} \quad \bar{D}_{c_j,j} \} \\
 &= \bigwedge_{i,j} \left\{ \begin{array}{ll} A_{i,j} \Rightarrow \bar{C}_{i+c_j,j} & A_{i,j} \Rightarrow \bar{D}_{i+c_j,j} \\ B_{i,j} \Rightarrow \bar{C}_{i+c_j,j} & B_{i,j} \Rightarrow \bar{D}_{i+c_j,j} \end{array} \right\} \wedge \bigwedge_j \{ \bar{C}_{c_j,j} \quad \bar{D}_{c_j,j} \}
 \end{aligned}$$



require row projections to be at most the given numbers

$$UBR = \bigwedge_{i,j} \{ (\bar{A}_{i,j} \wedge \bar{C}_{i,j}) \Rightarrow (B_{i,j+r_i} \vee D_{i,j+r_i}) \}$$

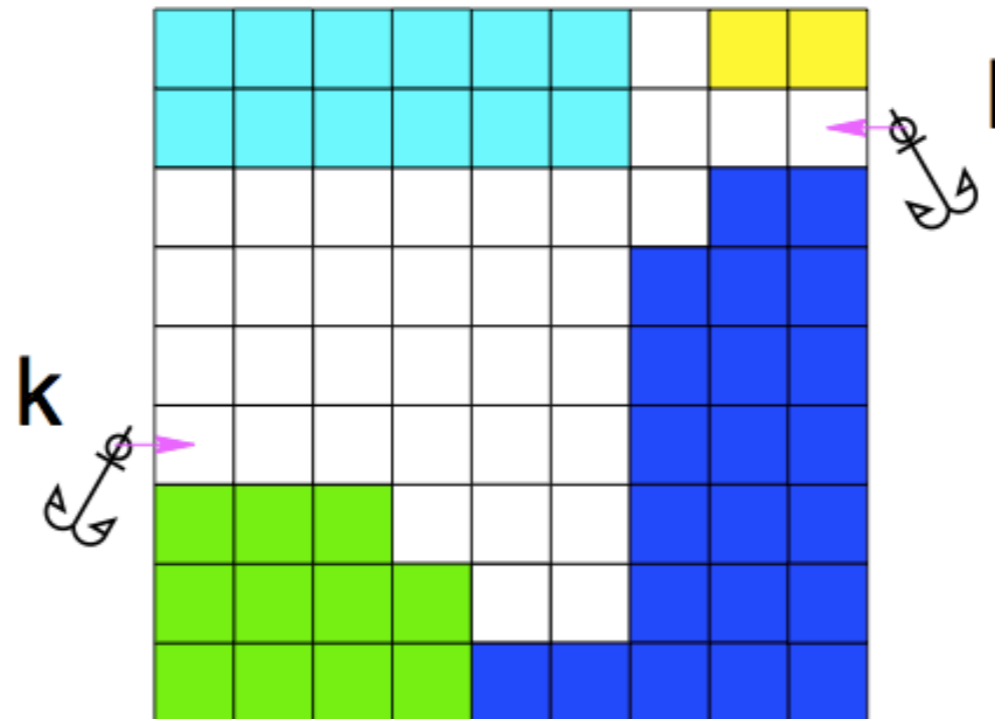


Problem: does not transform into 2-SAT clauses

work-around: fix cells on border to be part of solution

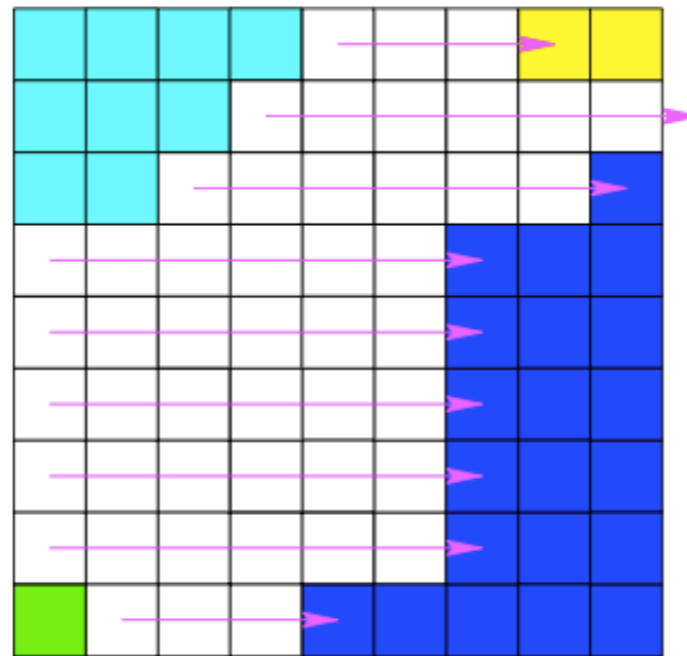
OK: only $O(n^2)$ possible *anchor* positions to test

$$Anc = (\overline{A}_{k,1} \wedge \overline{B}_{k,1} \wedge \overline{C}_{k,1} \wedge \overline{D}_{k,1}) \wedge (\overline{A}_{l,n} \wedge \overline{B}_{l,n} \wedge \overline{C}_{l,n} \wedge \overline{D}_{l,n})$$



now with the anchors, splits nicely
into 2-SAT clauses

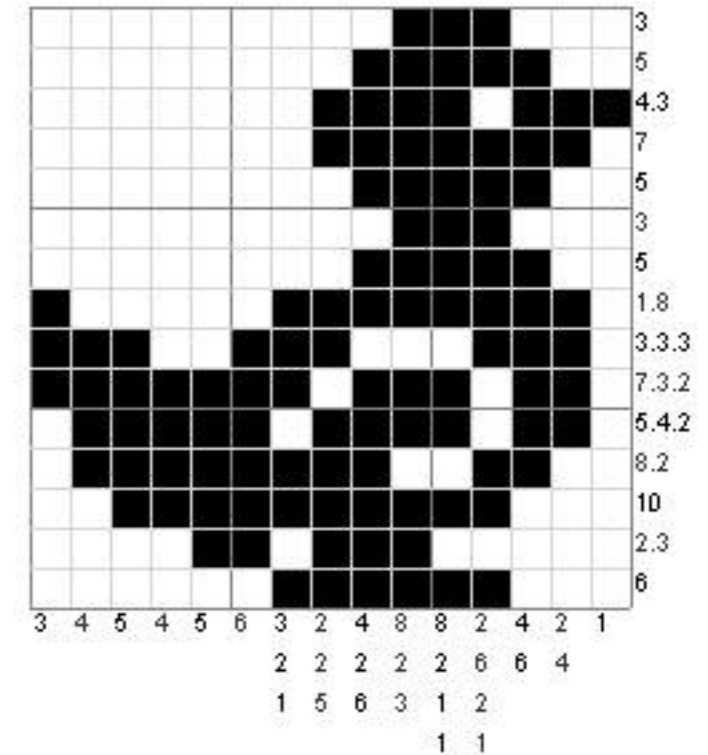
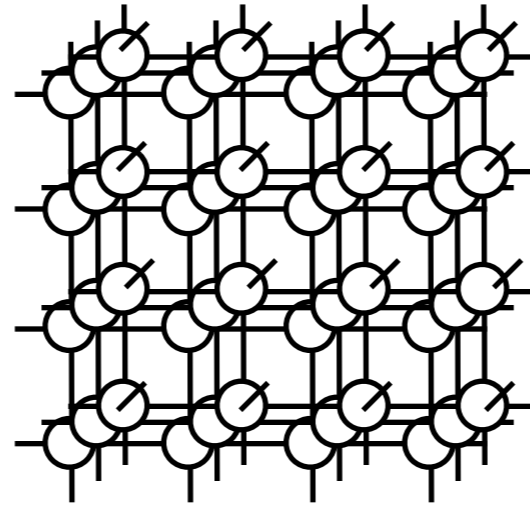
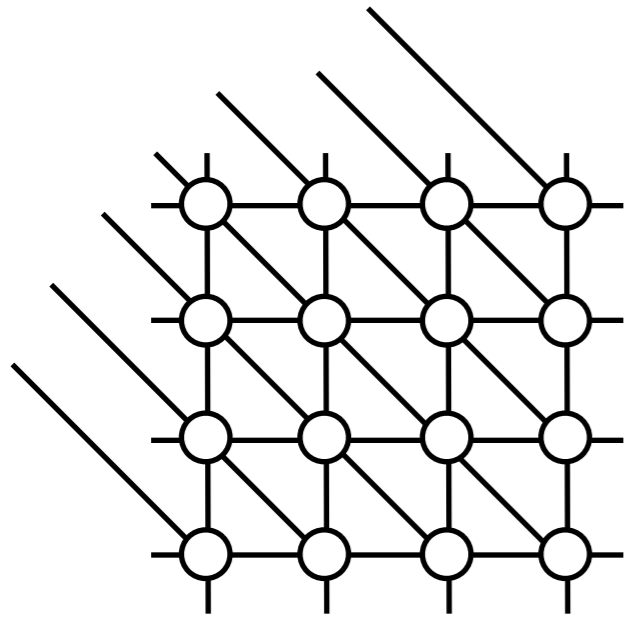
$$\begin{aligned}
 UBR &= \bigwedge_{i,j} \{ (\bar{A}_{i,j} \wedge \bar{C}_{i,j}) \Rightarrow (B_{i,j+r_i} \vee D_{i,j+r_i}) \} \\
 &= \bigwedge_j \left\{ \begin{array}{ll} \bigwedge_{i \leq \min\{k,l\}} \bar{A}_{i,j} \Rightarrow B_{i,j+r_i} & \bigwedge_{k \leq i \leq l} \bar{C}_{i,j} \Rightarrow B_{i,j+r_i} \\ \bigwedge_{l \leq i \leq k} \bar{A}_{i,j} \Rightarrow D_{i,j+r_i} & \bigwedge_{\max\{k,l\} \leq i} \bar{C}_{i,j} \Rightarrow D_{i,j+r_i} \end{array} \right.
 \end{aligned}$$



Final Complexity (quadratic in grid size):

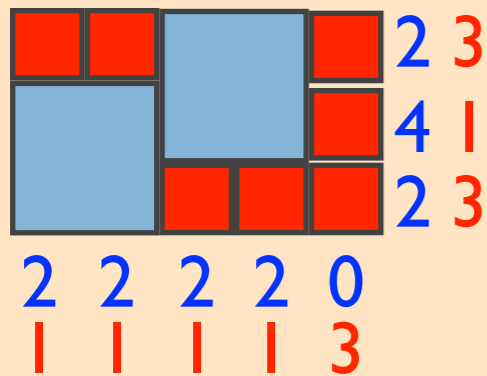
$O(n^2)$ 2-SAT formulae to check, each over $O(n^2)$ variables

many variants are NP-hard



- more than 2 projections
- 3-dimensions (colors)
- nonograms

Tomography of tilings

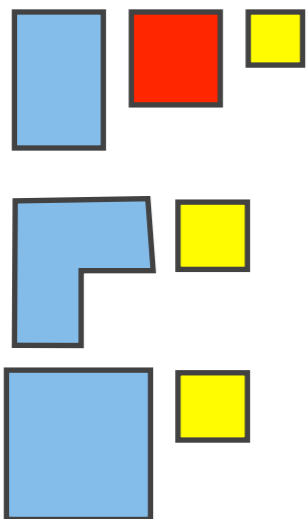


- fix a set S of tile types
- now the projections indicate for every row/column how many grid cells are covered by a type of tile
- complexity of the reconstruction problem depends on S

set S of tile types

complexity status

NP-hard



- $|S| \geq 3$ plus some cond.

[Gardner, Gritzmann, Prangenberg'98]

[D, Guíñez, Matamala'09]

[Chrobak, D, Guíñez, Lozano, Nguyen'10]

- S consists of a cell and a tile different from a bar

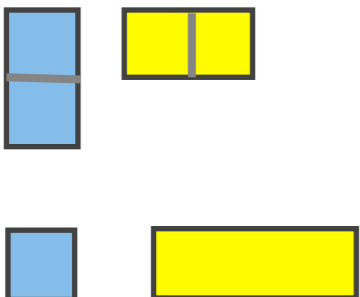
- S consists of 2 rectangles, and one has width, height ≥ 2

Open



- S consists of a $1 \times a$ tile and a $b \times 1$ tile with $a > b \geq 2$

polynomial



- S consists of 2 dominos

[Thiant'06]

- S consists of a cell and a $1 \times a$ tile with arbitrary a

[Picouleau'01]

[D, Goles, Rapaport, Rémila'03]

a polynomial algorithm for reconstruction of domino tilings

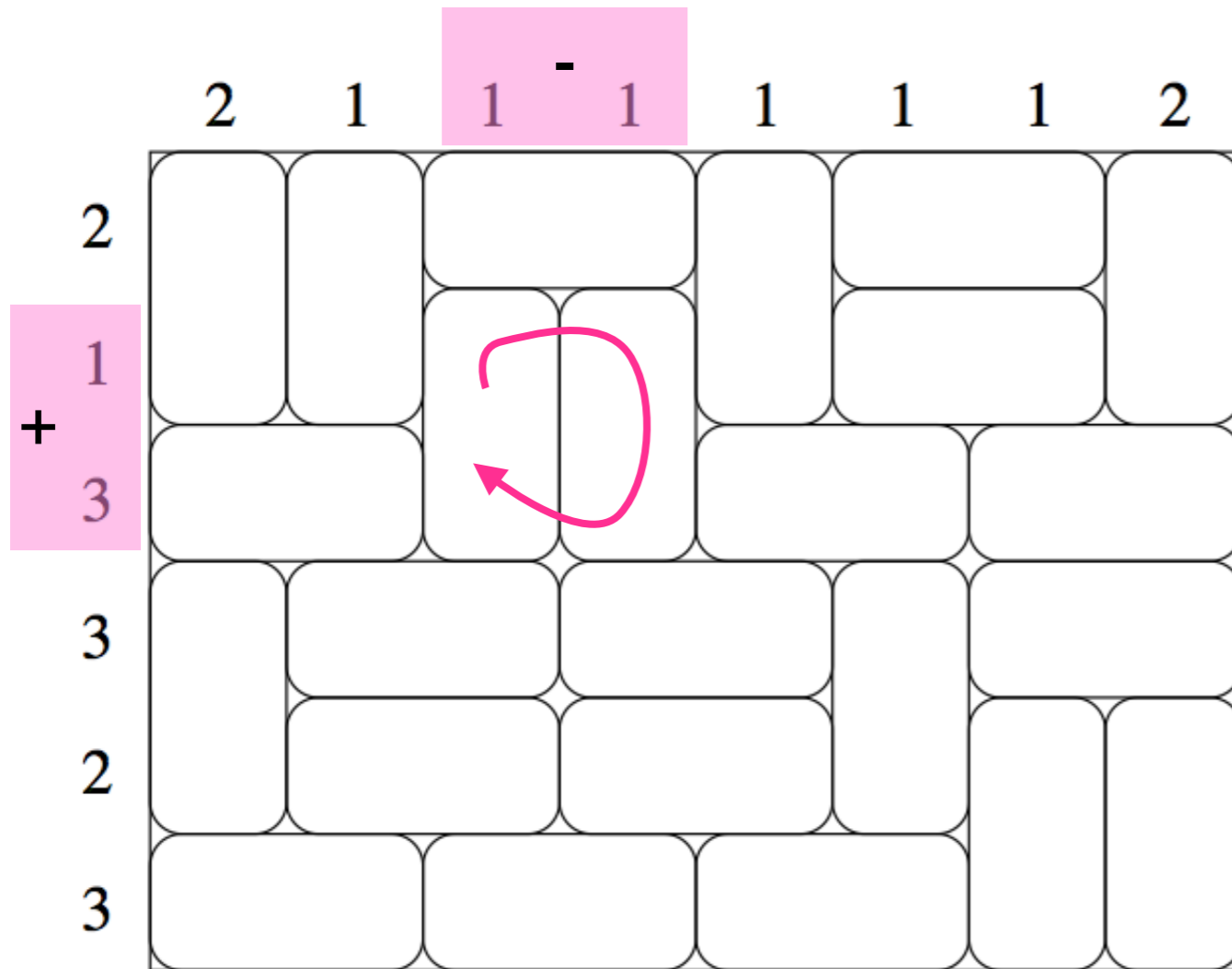
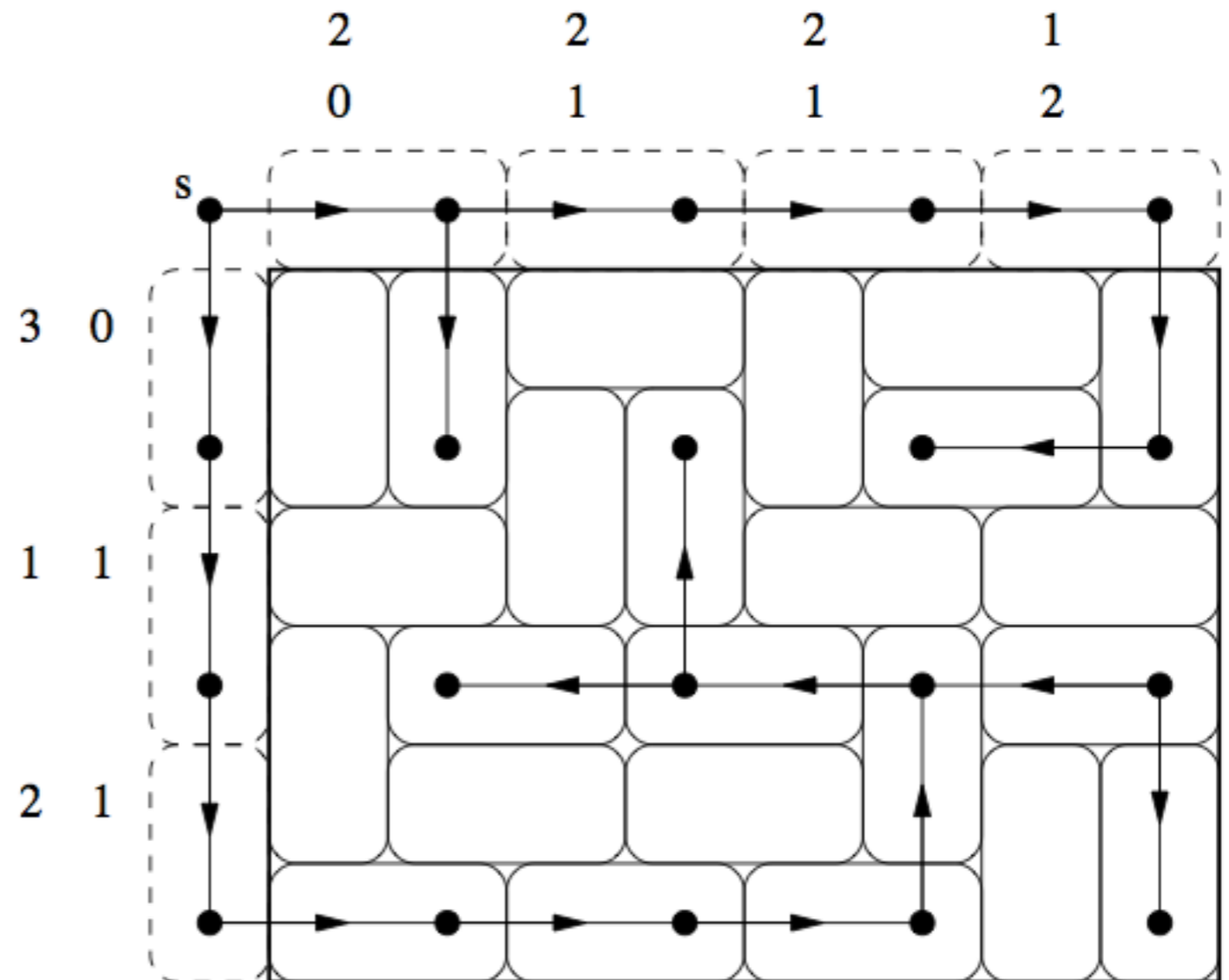


Figure: Nicolas Thiant

- [Problem] Ryser's theorem and the generalized algorithms heavily rely on a simple transformation of a tiling, which changes only column projections, while preserving row projections.
- At a first glance we seem to miss this

Ingredient 1: Temperley's bijection

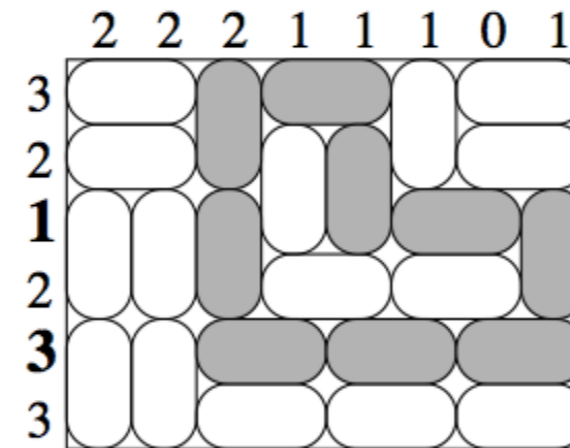
- [Wlog] we can assume that the grid to be tiled has odd*odd dimension minus upper left corner
- [Vertices] Consider cells of (odd,odd) coordinates.
- [Arcs] Covering domino defined directed connection with neighboring vertex
- [Spanning Tree] This is a directed spanning tree with root=upper left corner vertex
- [Thm] There is a bijection between domino tilings (and their projections) with directed spanning trees (and their projection)



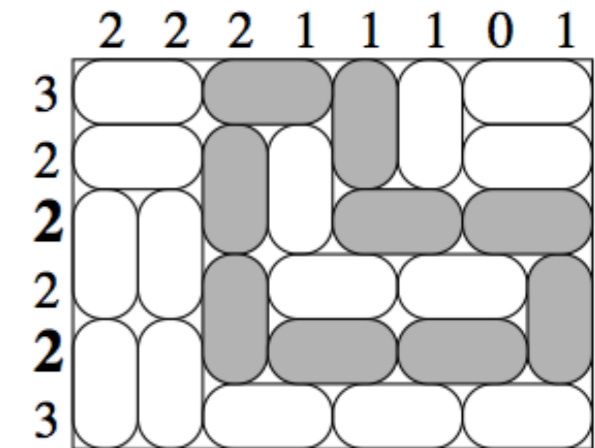
Ingredient 2: Simple transformation

[the one we were looking for]

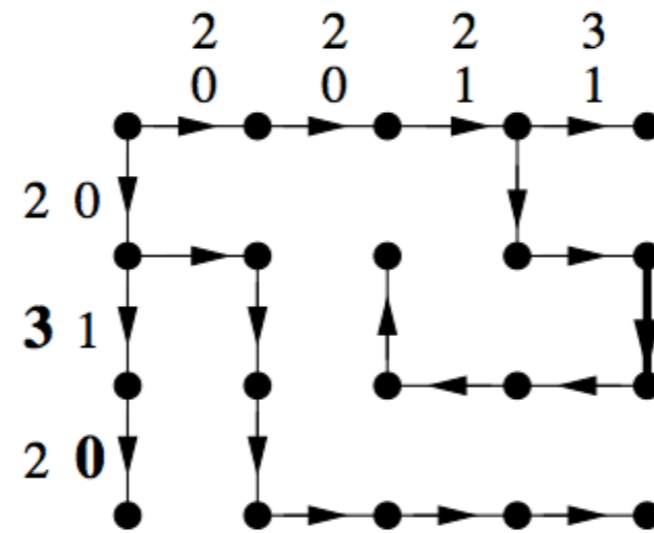
- Spanning trees can be transformed by changing origin of arc for some destination
- This changes only row projections
- [Algorithm] Start with a canonical tiling. Change until row projection are as required. Do the same for column projections.



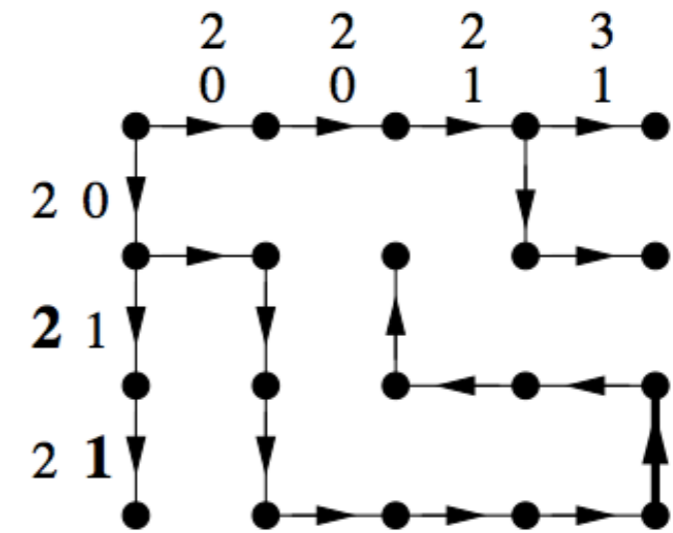
(a)



(b)



(a')



(b')

Open Problems

[the slide you were waiting for]

- [Fethi Jarray] place pebbles with given row and column projections such that for every pebble in (i,j) , we never have $(i,j-1)$ and $(i,j+1)$ empty.
- [domino tilings] Define and optimize algorithm. Formulate a characterization of projections which admit a solution.
- [prospective] relate methods from continuous math with methods from discrete math
- [practical] explore approximations for NP-hard tiling problems