

# Improving Solutions of Problems of Motion on Graphs by Redundancy Elimination

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# Problem of motion on a graph

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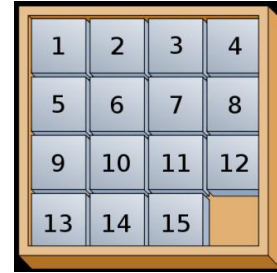
- ▶ **Abstraction** for tasks of motion of multiple (autonomous or passive) entities in a certain environment (real or virtual).
  - ▶ Entities have given an **initial** and a **goal** arrangement in the environment.
  - ▶ We need to **plan movements of entities in time**, so that entities reach the goal arrangement while **physical limitations are respected**.
- ▶ **Physical limitations** are:
  - ▶ Entities must **not collide with each other**.
  - ▶ Entities must **not collide with obstacles** in the environment..
- ▶ There are two basic **abstractions** of the task:
  - ▶ The problem of *pebble motion on a graph*.
  - ▶ The problem of *path-planning for multiple robots*.



# Problem of pebble motion on a graph (1)

Wilson, 1974; Kornhauser et al., 1984

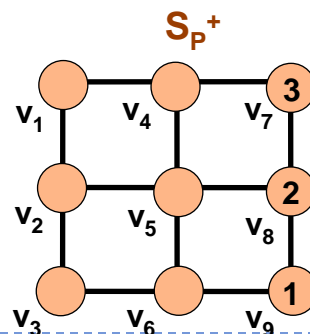
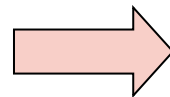
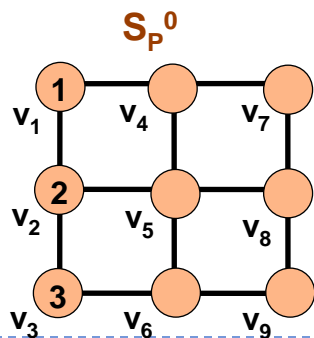
- ▶ A popular moving puzzle, that can be abstracted as the problem of pebble motion on a graph is known as **Lloyd's fifteen**.
  - ▶ Entities are represented by **pebbles** labeled by numbers.
- ▶ The environment is modeled as an **undirected graph** where **vertices represent locations** in the environment and **edges** represent possibility of going to the **neighboring location**.
- ▶ **Formal definition** of the task of pebble motion on a graph:
  - ▶ It is a quadruple  $\Pi = (G, P, S_p^0, S_p^+)$ , where:
    - ▶  $G=(V,E)$  is an **undirected graph**,
    - ▶  $P = \{p_1, p_2, \dots, p_\mu\}$ , where  $\mu < |V|$  is a **set of pebbles**,
    - ▶  $S_p^0: P \rightarrow V$  is a uniquely invertible function determining the **initial arrangement of pebbles** in vertices of  $G$ , and
    - ▶  $S_p^+: P \rightarrow V$  is a uniquely invertible function determining the **goal arrangement of pebbles** in vertices of  $G$ .



# Problem of pebble motion on a graph (2)

Wilson, 1974; Kornhauser et al., 1984

- ▶ Time is discrete in the model. **Time steps** and their ordering is isomorphic to the structure of natural numbers.
- ▶ The **dynamicity** of the task is as follows:
  - ▶ A pebble occupying a vertex at time step  $i$  can move into a neighboring vertex (the move is finished at time step  $i+1$ ) if the target vertex is **unoccupied** at time step  $i$  and **no other pebble** is moving simultaneously into the same target vertex
- ▶ For the given  $\Pi = (G, P, S_p^0, S_p^+)$ , we need to find:
  - ▶ A sequence of moves for every pebble such that dynamicity constraint is satisfied and every pebble reaches its goal vertex.



**Solution** of an instance of the problem of pebble motion on a graph with  $P=\{1,2,3\}$

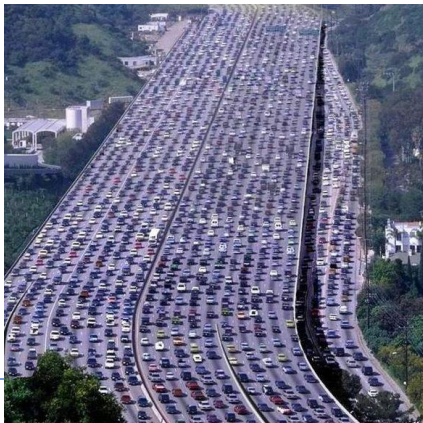
**makespan=7**

$M_1=[v_1, v_4, v_7, v_8, v_9, v_9, v_9]$   
 $M_2=[v_2, v_2, v_1, v_4, v_7, v_8, v_8]$   
 $M_3=[v_3, v_3, v_3, v_2, v_1, v_4, v_7]$

Time step:    **1**   **2**   **3**   **4**   **5**   **6**   **7**

# Is there any real-life motivation?

- ▶ Container rearrangement  
(entity = **container**)
- ▶ Heavy traffic  
(entity = **automobile** (in jam))
- ▶ Data transfer  
(entity = **data packet**)
- ▶ Generalized lifts  
(entity = **lift**)



# Is the motion task **easy** or **hard**?

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- ▶ **Basic** variant of the task is **easy to solve**:

- ▶ There exists an algorithm with **worst case time complexity** of  $O(|V|^3)$  that generates solutions of the **makespan**  $O(|V|^3)$  for any instance of pebble motion on  $G=(V,E)$  (Kornhauser et al., 1984).

- ▶ If we want a **solution** that is **as short as possible** the complexity increases:

- ▶ The optimization variant of the problem of pebble motion on a graph is **NP-hard** (Ratner a Warmuth, 1986).

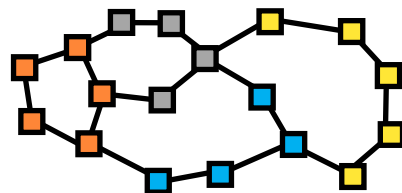
- ▶ We focused on generating and improving **sub-optimal** solutions:

- ▶ Restriction on **bi-connected graphs** – the task is almost always solvable.
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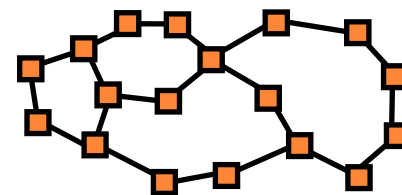


# The case with **bi-connected graph**

- ▶ Instances over bi-connected graph are practically most important.
  - ▶ Almost all the goal arrangements of pebbles are **reachable** from any initial arrangement.
- ▶ We allow only a **single unoccupied vertex** (this represents the most difficult case).
- ▶ An undirected graph  $G=(V,E)$  is **bi-connected** if  $|V| \geq 3$  and  $\forall v \in V$  the graph  $G=(V-\{v\},E')$  where  $E'=\{\{x,y\} \in E \mid x,y \neq v\}$  is connected.
- ▶ The **important property**: Every bi-connected graph can be constructed from a **cycle** by adding **handles**.  
→ **handle decomposition**



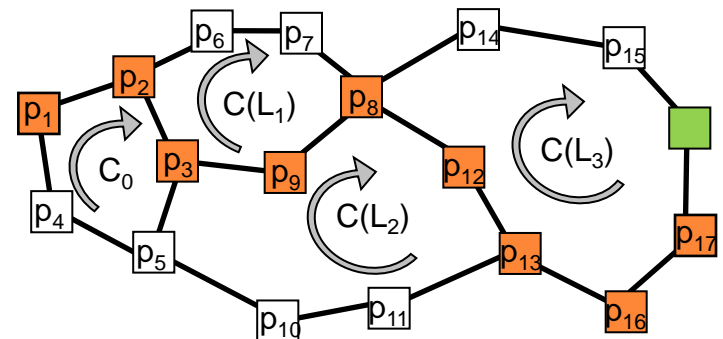
- initial cycle
- 1<sup>st</sup> handle
- 2<sup>nd</sup> handle
- 3<sup>rd</sup> handle



# Algorithm **BIBOX- $\theta$** (1)

Surynek, 2009

- ▶ Algorithm **BIBOX- $\theta$**  solves tasks of pebble motion on a graph.
  - ▶ The input graph is supposed to be **bi-connected**.
    - ▶ The algorithm exploits handle decomposition of the input graph.
  - ▶ Just **one vertex** is supposed to be **unoccupied**.
    - ▶ If this is not the case, dummy pebbles are added to the graph. They are eventually filtered out of the final solution.
  - ▶ Algorithm produces a solution of any instance over  $G=(V,E)$  in the worst case time of  $O(|V|^4)$ , however practically better than (Kornhauser et al., 1984).
- ▶ The basic ability is to move a pebble into a selected vertex:
  - ▶ **Transfer** of the unoccupied vertex,
  - ▶ **rotations** along handles.

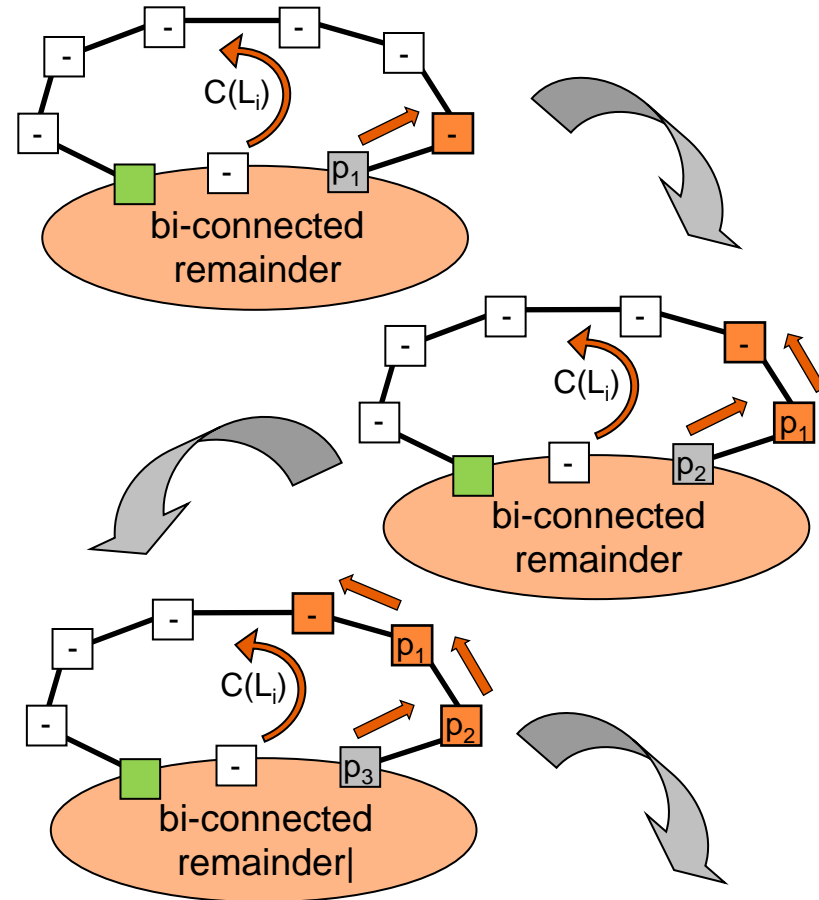
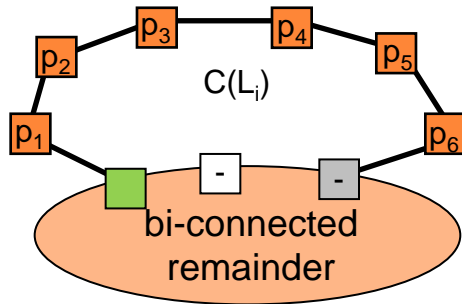




# Algorithm BIBOX- $\theta$ (2)

- ▶ Using the ability of moving a selected pebble into a selected vertex more complex movements can be done:

- ▶ Stacking pebble into a handle:



- ▶ The process of **stacking**

- ▶ Consider the **last handle**

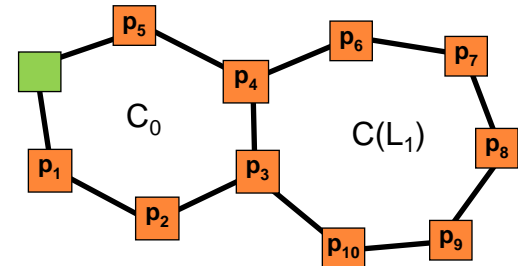
- ▶ Move the pebble into the **grey** vertex.
- ▶ A rotation of the handle is made using the **green** unoccupied vertex.

▶ ...

...

## Algorithm **BIBOX- $\theta$** (3)

- ▶ Initial cycle and the first handle (so called  **$\theta$ -like graph**) represent a special case.
  - ▶ The process of stacking does not work here.
- ▶ The resulting (even) **permutation** of pebbles is composed of rotations along 3-cycles (without further details).
  - ▶ **Bottleneck** of the algorithm – known constructions of solutions to 3-cycle rotations use too many moves.
  - ▶ We exploit a **database** containing pre-computed optimal solutions to 3-cycle rotations instead (a form of pattern database)
  - ▶ The **overall sub-optimal solution** is composed of optimal solutions to 3-cycle rotations.
    - ▶ → **Sub-optimal** solution of relatively high quality.



## The **major drawback** of the described process

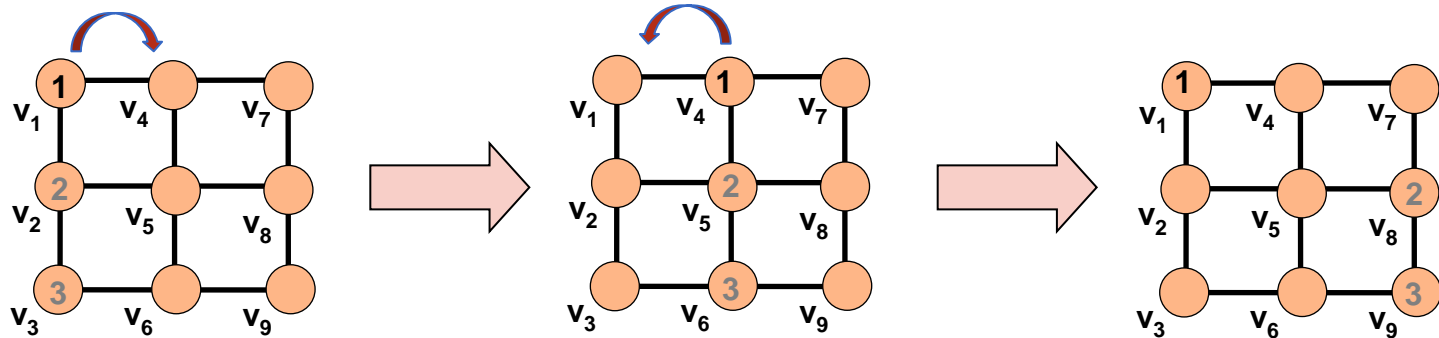
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- ▶ If the initial graph is not fully occupied by pebbles at the beginning.
  - ▶ **Dummy pebbles are added**, modified instance is solved.
  - ▶ Movements of dummy pebbles are **filtered out** eventually.
- ▶ Several types of **redundancies** in generated solutions were discovered using visualization software **GraphRec** (Koupy, 2010):
  - ▶ **(i) Inverse moves**
    - ▶ A move that reverts the directly preceding move.
  - ▶ **(ii) Redundant moves**
    - ▶ A sequence of moves that relocates a pebble into the same vertex (notice possible interference).
  - ▶ **(iii) Long sequence of moves**
    - ▶ A sequence of moves that relocates a pebble into some vertex while there exists a shorter sequence doing the same (notice possible interference).



## (i) Inverse moves

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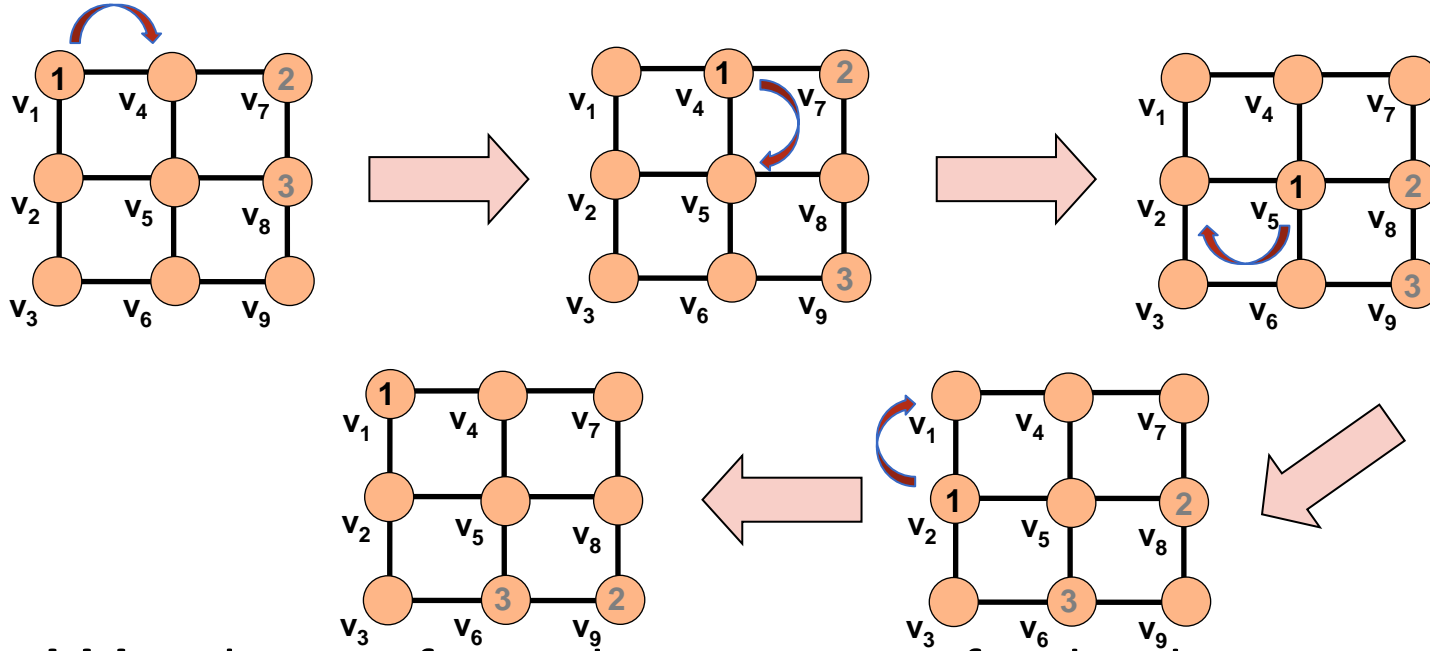


▶ **Pebble 1** has performed a pair of **inverse** moves.

- ▶ Let us have a sequence of moves  $\Phi$
- ▶ A simple algorithm can eliminate inverse moves from  $\Phi$  in the worst case time of  $O(|\Phi|^2)$
- ▶ Removal of a single pair of inverse moves can result into occurrence of a new pair of inverse moves.

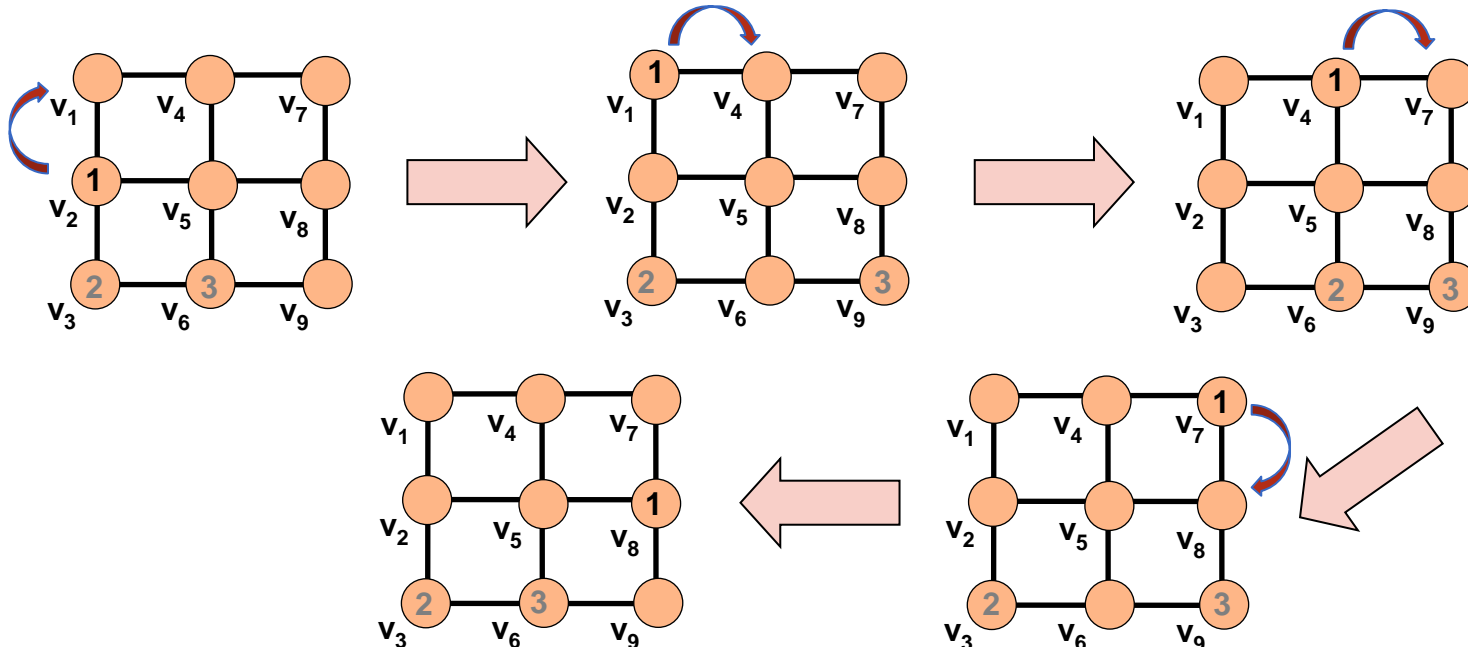


## (ii) Redundant moves



- ▶ **Pebble 1** has performed a sequence of redundant moves.
  - ▶ It has returned to the starting vertex without interfering with other pebbles.
  - ▶ A simple algorithm can eliminate redundant moves from  $\Phi$  in the worst case time of  $O(|\Phi|^4)$ .
  - ▶ New redundant sequences can appear as well.

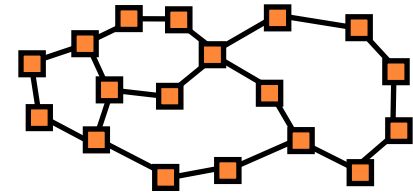
### (iii) Long sequence of moves



▶ **Pebble 1** has performed **long sequence** of moves.

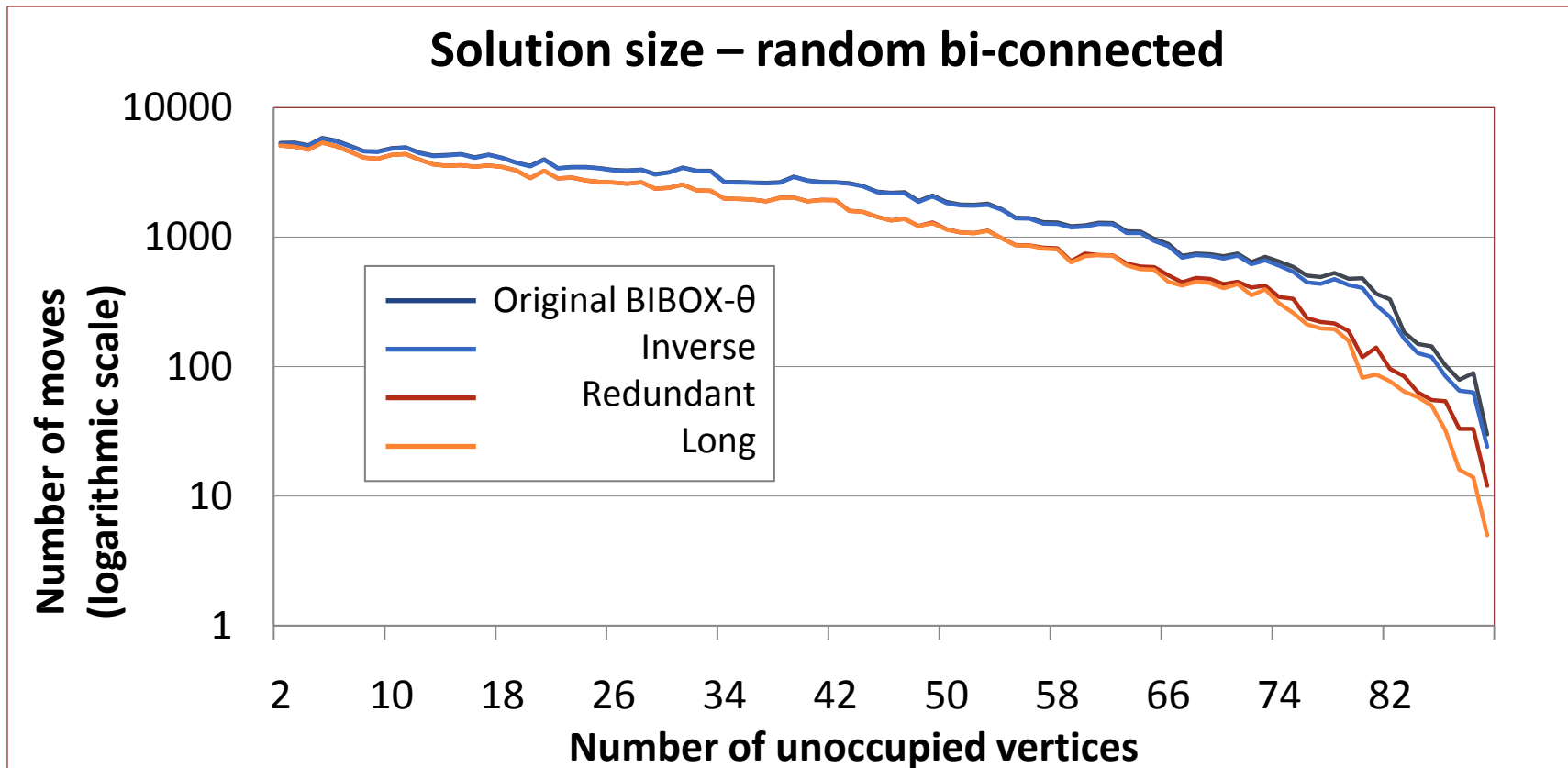
- ▶ It is possible to go along a shorter path without interfering with other pebbles.
- ▶ A simple algorithm can eliminate long sequences from  $\Phi$  in the worst case time of  $O(|\Phi|^4 + |\Phi|^3 |V|^2)$ .
- ▶ Again, new long sequences of moves can appear.

# Experimental evaluation (1)



## ▶ Random bi-connected graph:

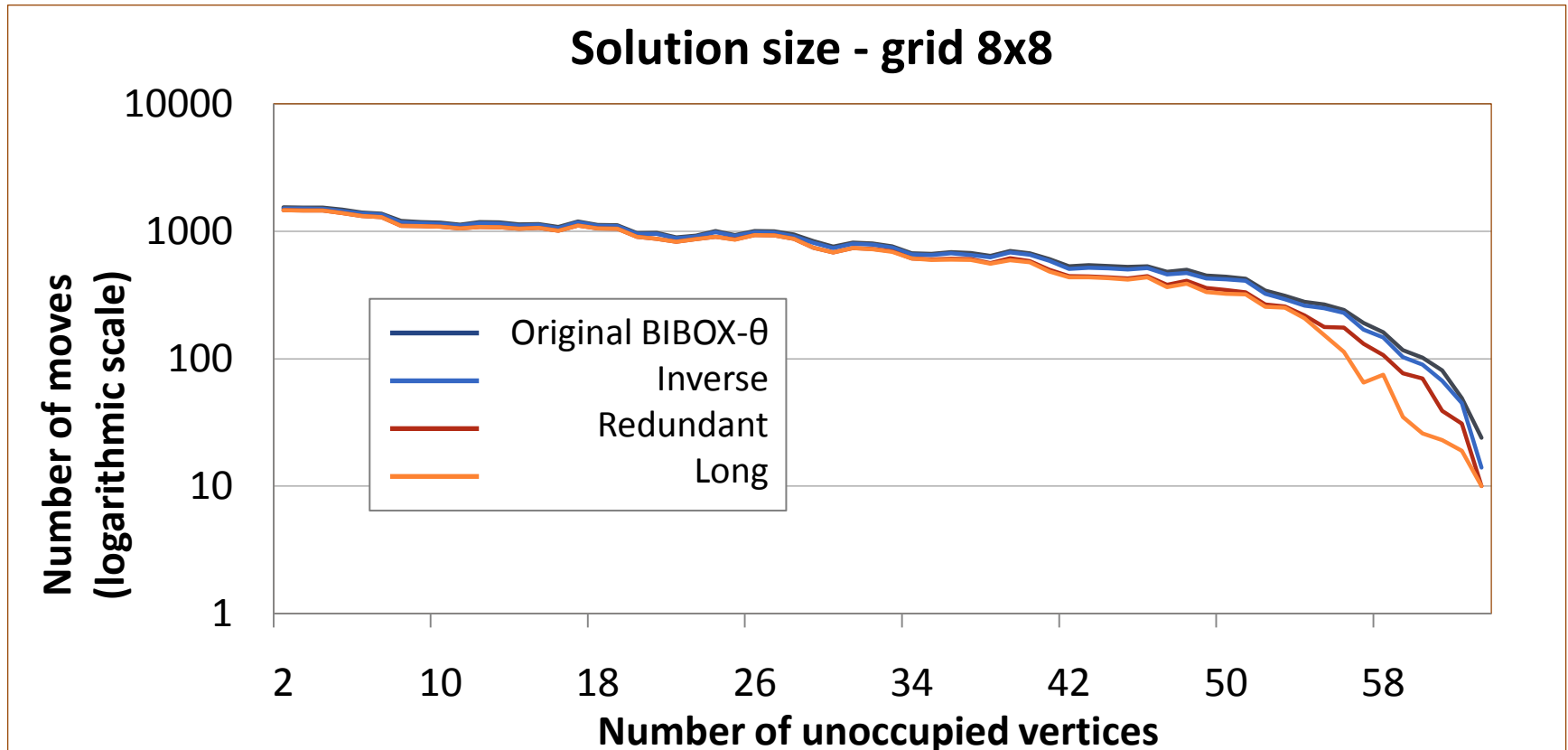
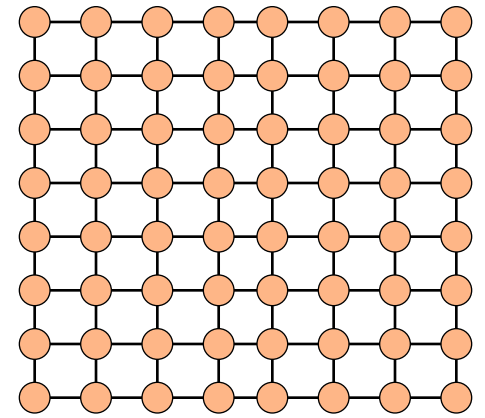
- ▶ Addition of handles of random lengths to the currently constructed graph.
- ▶ Initial and goal arrangement of pebbles are **random permutations**.



# Experimental evaluation (2)

## ▶ Grid 8x8:

- ▶ The initial and goal arrangement of pebble is a **random permutation** again.





# Concluding remarks

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- ▶ Visualization software **GraphRec** has been used to acquire knowledge about solutions of instances of pebble motion problem.
- ▶ Acquired knowledge has been used to **identify** redundancies and to develop algorithms to eliminate them.
- ▶ The experimental evaluation showed that the proposed elimination of redundancies can improve solutions significantly.
  - ▶ Especially if there are many unoccupied vertices

