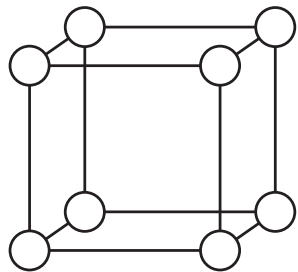


A Heuristic Method of Generating Diameter 3 Graphs for Order/Degree Problem

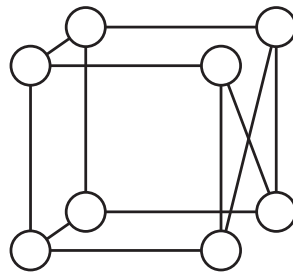
Teruaki Kitasuka and Masahiro Iida

Graduate School of Science and Technology

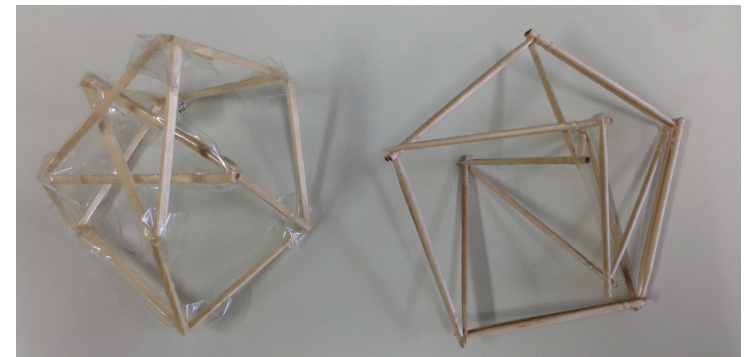
Kumamoto University



Cube; $k=3$, $l=1.71$ (Gap 9.1%)



Möbius loop; $k=2$, $l=1.57$ (Gap 0.0%)

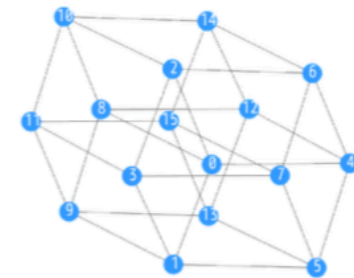
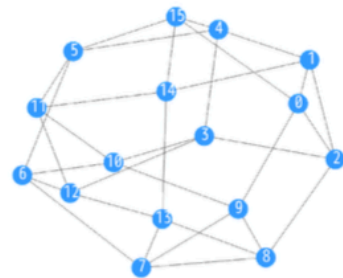
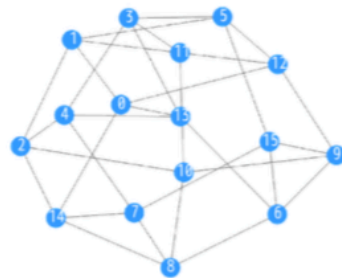


Graph Golf: Order/Degree (OD) Problem

- Find a graph that has smallest diameter & average shortest path length (ASPL) for a given order and degree
 - ✓ Find a better topology for various applications
 - ✓ Other problem: diameter/degree (DD) problem

● Lessons

Size=16
Degree=4



Diameter

3

3

4

Avg. shortest
path length

1.942

1.983

2.133

(from The Order/degree Problem Competition Web site
<http://research.nii.ac.jp/graphgolf/>)

Outline

Home
Problem
Solutions
Submit
Event
Q&A
About

Graph Golf

The Order/Degree Problem Competition

Find a graph that has smallest diameter & average shortest path length given an order and a degree.

Best solutions

Update 2015-10-06

Degree d	Order n				
	16	64	256	4096	10000
3	3 / 2.200 0.000%	5 / 3.770 0.211%	8 / 5.636 0.861%	13 / 9.787 2.928%	15 / 11.122 3.225%
4	3 / 1.750 0.962% ²	4 / 2.869 0.417%	6 / 4.134 1.065%	9 / 6.756 4.423%	10 / 7.601 3.480%
16	N/A	2 / 1.746 0.000%	3 / 2.093 8.026% ²	4 / 3.254 8.768%	5 / 3.626 1.072%
23	N/A	2 / 1.635 0.000% ¹	2 / 1.910 0.000%	4 / 2.887 0.752%	4 / 3.201 8.697%
60	N/A	2 / 1.048 0.000% ¹	2 / 1.765 0.000% ¹	3 / 2.295 8.976%	3 / 2.650 0.624%
64	N/A	N/A	2 / 1.749 0.000% ¹	3 / 2.242 12.994% ²	3 / 2.610 1.012%

Legend: Diameter / Average shortest path length (ASPL)
Gap from the lower bound of ASPL (%)

Notes:
1. A random graph is optimal. Submissions with this size will not be awarded.
2. There are no graphs with this size that satisfy the lower bound of diameter and ASPL [Erdős 1980].

[Show complete list](#)

- Our results, inc. graphs found after competition
- Observation of Small Order Graphs
- Heuristic Algorithm for Large Diameter 3 Graphs
 - ✓ Policy, Create a Base Graph G_0 , Greedily Add Edges One by One to G_0
- A Technique of 2-Opt Local Search
 - ✓ Edge Importance Function, Order of Local Search
- Conclusion

Our results, including graphs found after competition

Average shortest path length (\bar{l})

degree	Order n																																																										
d	16	64	256	4096	10000																																																						
3	2.200 (July, *2) (= best known)																																																										
4	1.750 (July, *2) (= best known)																																																										
16	(N/A)		2.09069 (After c., *3) (< 2.09274 best known)	(3.25426873 best known)	(3.62562128 best known)																																																						
23	<table border="1"> <thead> <tr> <th colspan="6">Diameter k (lower bound; best known)</th> </tr> <tr> <th>degree</th> <th colspan="5">order n</th> </tr> <tr> <th>d</th> <th>16</th> <th>64</th> <th>256</th> <th>4096</th> <th>10000</th> </tr> </thead> <tbody> <tr> <td>3</td> <td>3; 3</td> <td>5; 5</td> <td>7; 8</td> <td>11; 13</td> <td>12; 15</td> </tr> <tr> <td>4</td> <td>2; 3</td> <td>4; 4</td> <td>5; 6</td> <td>7; 9</td> <td>8; 10</td> </tr> <tr> <td>16</td> <td>N/A</td> <td>2; 2</td> <td>2; 3</td> <td>4; 4</td> <td>4; 5</td> </tr> <tr> <td>23</td> <td>N/A</td> <td>2; 2</td> <td>2; 2</td> <td>3; 4</td> <td>3; 4</td> </tr> <tr> <td>60</td> <td>N/A</td> <td>2; 2</td> <td>2; 2</td> <td>3; 3</td> <td>3; 3</td> </tr> <tr> <td>64</td> <td>N/A</td> <td>N/A</td> <td>2; 2</td> <td>2; 3</td> <td>3; 3</td> </tr> </tbody> </table>					Diameter k (lower bound; best known)						degree	order n					d	16	64	256	4096	10000	3	3; 3	5; 5	7; 8	11; 13	12; 15	4	2; 3	4; 4	5; 6	7; 9	8; 10	16	N/A	2; 2	2; 3	4; 4	4; 5	23	N/A	2; 2	2; 2	3; 4	3; 4	60	N/A	2; 2	2; 2	3; 3	3; 3	64	N/A	N/A	2; 2	2; 3	3; 3
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Note: *1: best solution in comp.

*2: best but late submission

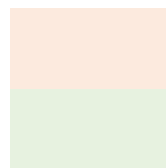
*3: best after competition

Observation of Small Order Graphs

Table of the Orders of the Largest Known Graphs for the Degree Diameter Problem

d / k	2	3	4	5	6	7	8	9	10
3	10	20	38	70	132	196	336	600	1250
4	15	41	98	364	740	1320	3243	7575	17703
5	24	72	212	624	2772	5516	17030	57840	187056
6	32	111	390	1404	7917	19383	76461	331387	1253615
7	50	168	672	2756	11988	52768	249660	1223050	6007230
8	57	253	1100	5060	39672	131137	734820	4243100	24897161

d : degree, k : diameter



The Petersen and Hoffman–Singleton graphs. Moore bound (Optimal)

Other non Moore but optimal graphs

from Combinatorics Wiki

<http://moorebound.indstate.edu/wiki/>

The_Degree_Diameter_Problem_for_General_Graphs

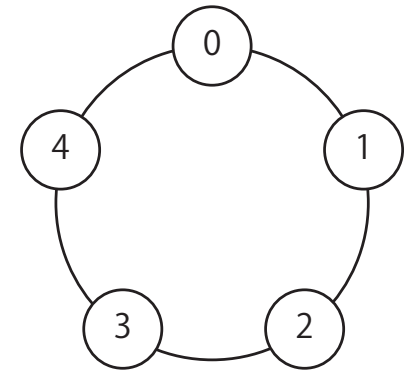
Aug. 31-Sep. 2, 2016, NOCS 2016, Nara, Japan

Observation of Small Order Graphs

General Issue of Diameter and Cycles

Diameter $k = 2$ graphs with degree d

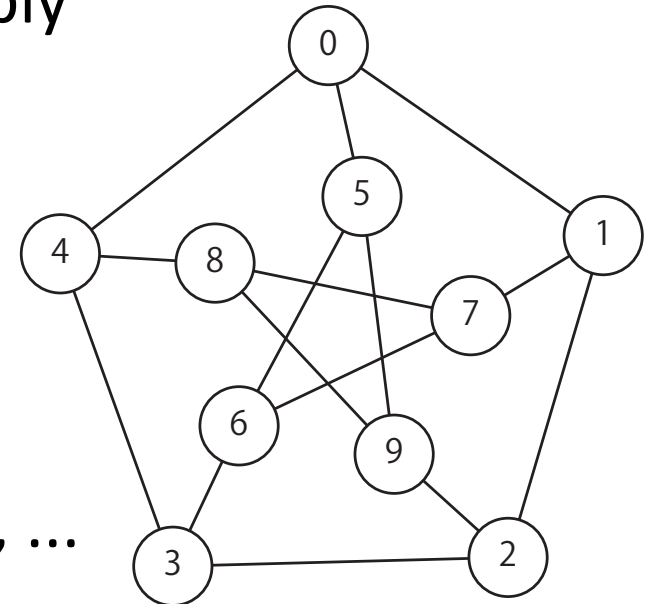
- $d = 2$: a 5-node cycle
- $d = 3$: Petersen graph ($n = 10$)
- $d = 7$: Hoffman-Singleton graph ($n = 50$)
- $d > 3$: (4 or less)-node cycles are probably redundant



Diameter $k = 3$ graphs with degree d

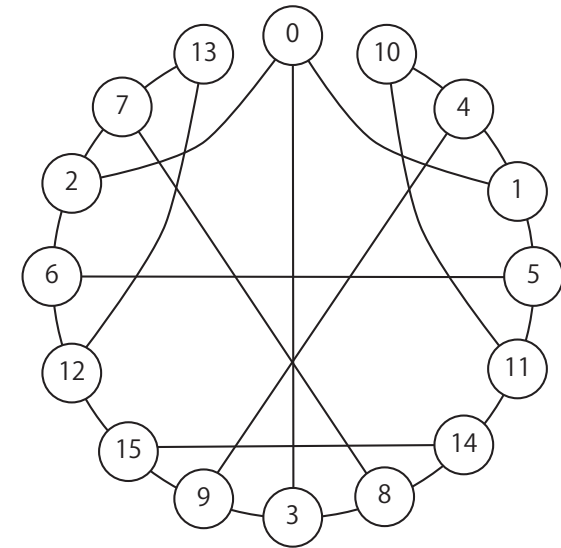
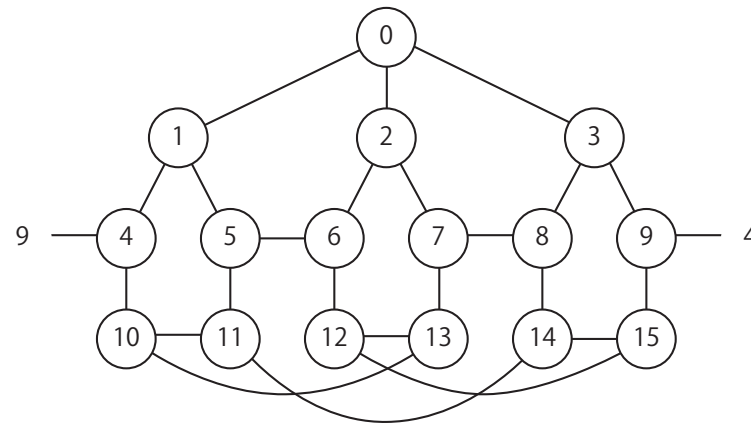
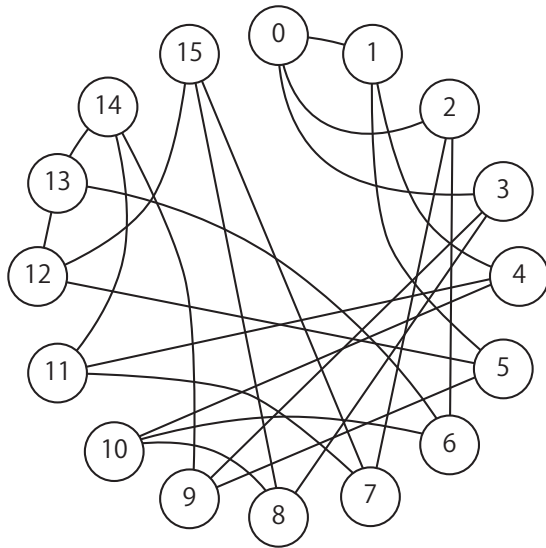
- $d = 2$: 7-node cycle is the best
- $d > 2$: (6 or less)-node cycles are probably redundant

So, try to make 7-node cycles. However, ...



Observation of Small Order Graphs

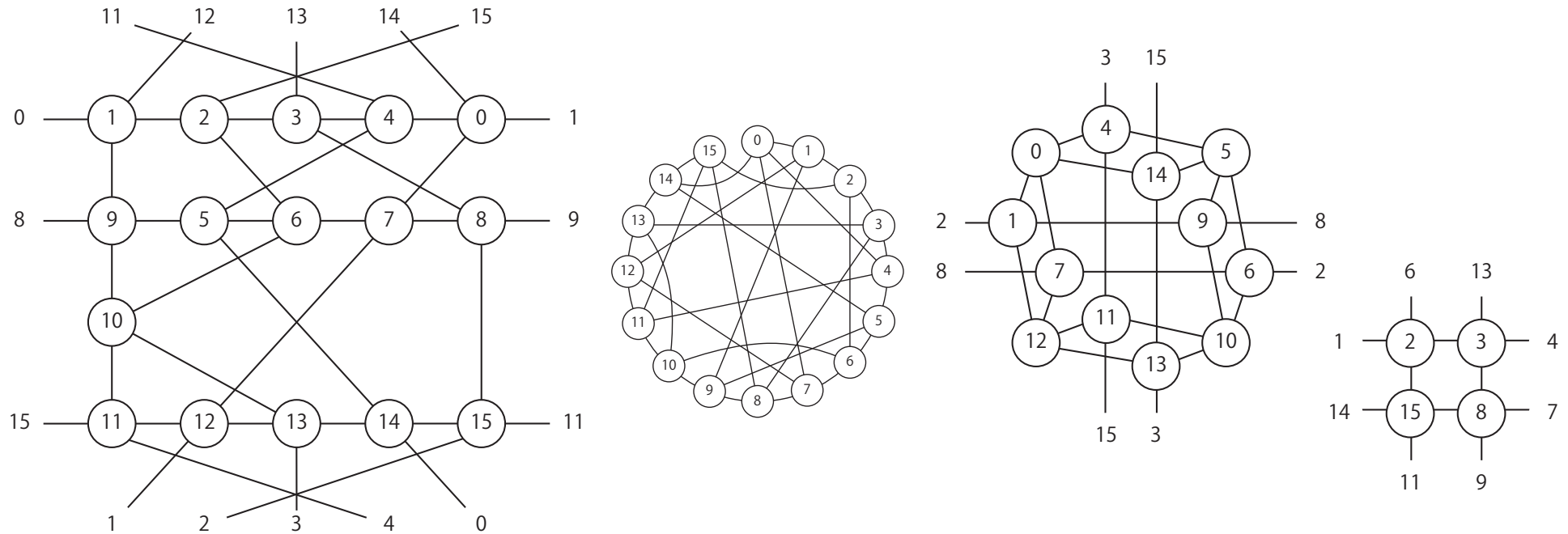
$n = 16, d = 3$ graph has $k = 3, l = 2.200$



- Many 5-node cycles and no 4-node cycles.
- We will try to increase # of 5-node cycles (pentagons).

Observation of Small Order Graphs

$n = 16, d = 4$ graph has $k = 3, l = 1.750$



- Many 5-node cycles.
- # of 4-node cycles is 5 (5-6-10-9, 10-11-12-13, 0-4-5-14, 0-1-12-7, 2-3-8-15)

Heuristic Algorithm for Large Diameter 3 Graphs

Targeted Graphs of Diameter $k = 3$

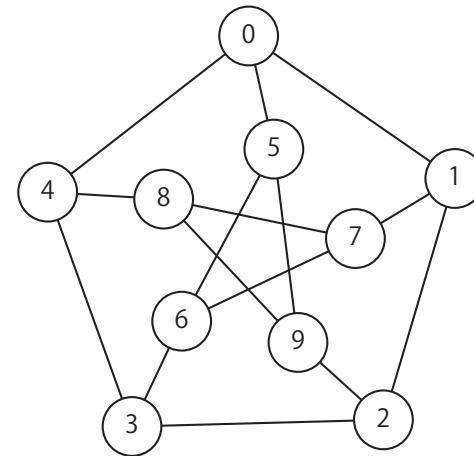
- $n = 256, d = 16: k = 3$ (Moore bound = 2)
- $n = 4096, d = \underline{60}$ and $\underline{64}: k = 3$ (Moore bound = 3 and 2)
- $n = 10000, d = \underline{60}$ and $64: k = 3$ (Moore bound = 3)

degree	Order n		
d	256	4096	10000
16	2.09069 (After c., *3) <u>2.12757</u> (< 2.09274 best known)		
60		2.295216 (After c., *1) <u>2.295275</u> (Aug.)	2.648977 (After c., *3) <u>2.648980</u> (After c.) (2.650399 best known)
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Heuristic Algorithm for Large Diameter 3 Graphs

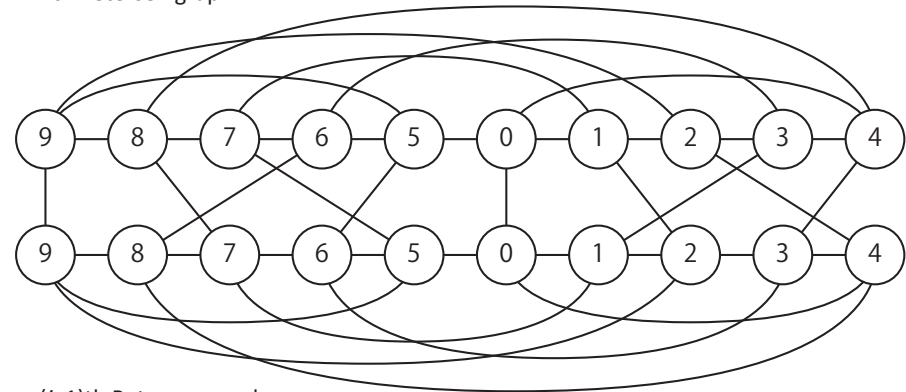
Outline of Heuristic Algorithm

1. Create a Base graph G_0 : for targeted diameter k , connect small order graphs of diameter is $k - 1$. For $k = 3$, Petersen graph (diameter = 2) is the small graph.



i -th Petersen graph

2. Greedily Add Edges One by One to G_0 : to increase the number of $(2k-1)$ -node cycles (pentagons for $k = 3$).

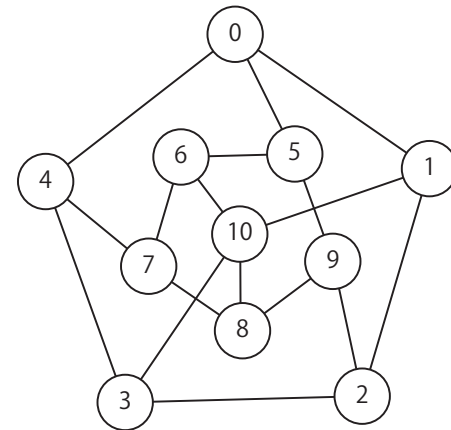
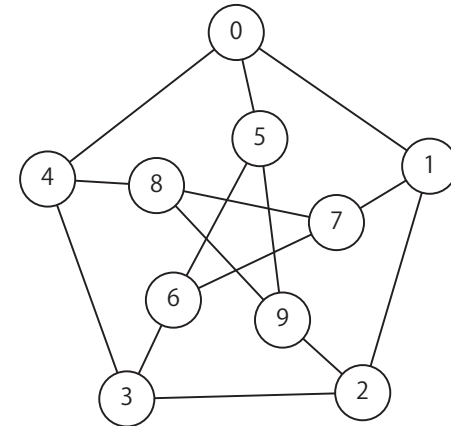


$(i+1)$ th Petersen graph

Heuristic Algorithm for Large Diameter 3 Graphs

Step 1: Create a Base graph G_0 (1/2)

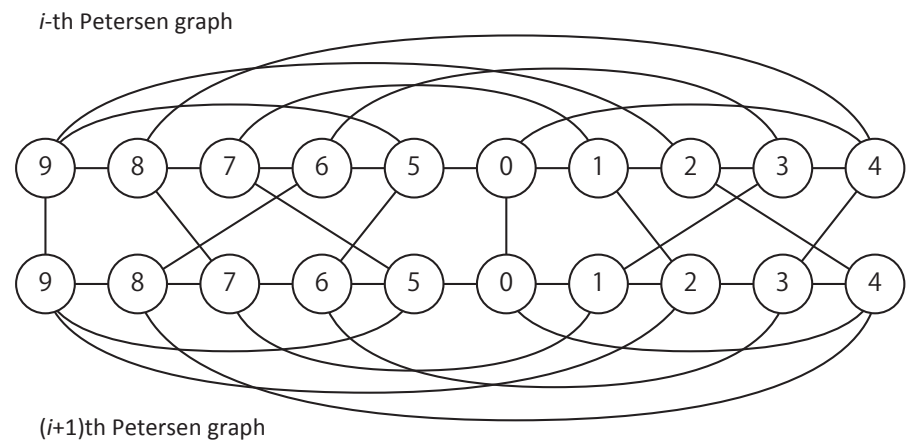
- For targeted diameter $k = 3$, connect Petersen graphs (diameter is 2).
- $n = 10000$: 1000 Petersen graphs (diameter = 2) are connected.
- $n = 4096$: (409 – 6) Petersen graphs and six 11-node graphs are connected.



Heuristic Algorithm for Large Diameter 3 Graphs

Step 1: Create a Base graph G_0 (2/2)

- Each small (Petersen) graph is connected with two adjacent graphs.
- When the small graphs are numbered 1, 2, 3, ..., m ($m = \lfloor n/10 \rfloor$), i -th and $(i+1)$ -th graphs are connected, for $i = 1, \dots, m - 1$.
- A node in i -th graph is connected with a node in $(i+1)$ -th graph.
- Finally, each node has five edges at most.



Heuristic Algorithm for Large Diameter 3 Graphs

Step 2: Greedily Add Edges to G_0 (1/2)

Our policies to add an edge:

- Select a node (i) which has the smallest degree for one side of new edge.
- Select a node (j) for another side of new edge, to increase the number of pentagons.
- No track back.

Algorithm 3 Greedily add edges, one by one to G_0

```
1: procedure ADDEDGES( $n, d, G_0$ )
2:    $G \leftarrow G_0$ 
3:   while edge can be added do
4:     Select a node  $i$  from the smallest degree nodes
5:     Compute node set  $J$  such that  $d(i, j) > 2$ 
6:     for each node  $j \in J$  do
7:        $p_1(j) = \text{COUNTPATHS}(i, j)$ 
8:        $p_2(j) = 0$ 
9:       for each  $k \in j$ 's neighbors do
10:        if  $\text{COUNTPATHS}(i, k) > p_2(j)$  then
11:           $p_2(j) = \text{COUNTPATHS}(i, k)$ 
12:        end if
13:      end for
14:    end for
15:    Select  $j \in J$  that satisfies conditions (1) and (2)
16:    Add an edge  $i$ - $j$  to graph  $G$ 
17:  end while
18:  If degree of several nodes are less than  $d$ , add several
  edges between them
19: end procedure
20: function COUNTPATHS( $i, j$ )
21:    $p = |D_1(i) \cap D_2(j)| + |D_2(i) \cap D_1(j)|$   $\triangleright$  Roughly
  count the number of paths with distance 3 between node
   $i$  and  $j$ , for graph  $G$ 
22: end function
```

Heuristic Algorithm for Large Diameter 3 Graphs

Step 2: Greedily Add Edges to G_0 (2/2)

To increase the number of pentagons.

- CountPaths function roughly counts the number of path of length 3 for a given pair of nodes.
- For each candidate of j and each neighbor k of j , compute CountPaths(i, k) and select j with a k which has the largest value of CountPaths.

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```
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Heuristic Algorithm for Large Diameter 3 Graphs

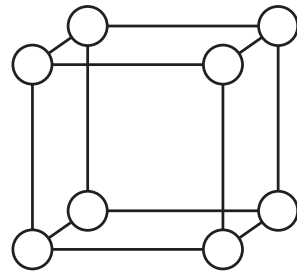
Targeted Graphs of Diameter $k = 3$

- $n = 256, d = 16: k = 3$ (Moore bound = 2)
- $n = 4096, d = \underline{60}$ and $\underline{64}: k = 3$ (Moore bound = 3 and 2)
- $n = 10000, d = \underline{60}$ and $64: k = 3$ (Moore bound = 3)

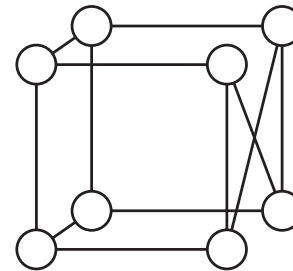
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64		2.242170 (Oct., *1) <u>2.242228</u> (Sep.,)	<u>2.611310</u> (After c.) (> 2.610117 best known)

A Technique of 2-Opt Local Search

2-Opt Local Search (flip two edges)



Cube; $k=3$, $l=1.71$ (Gap 9.1%)

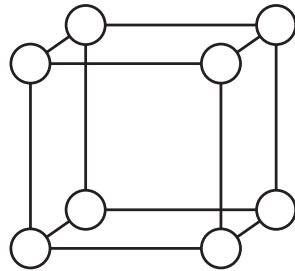


Möbius loop; $k=2$, $l=1.57$ (Gap 0.0%)

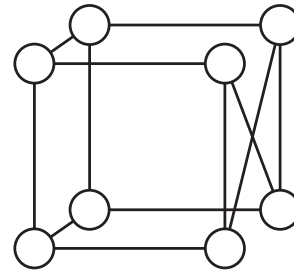
- 2-Opt: keeping flipped graph, if flipped graph has better diameter / ASPL.
- There are so many pairs of edges.
of edges $m = nd/2$. # of pairs of edges = $m(m-1)/2$.
- For a graph with $n = 10,000$ and $d = 60$, $m = 6 \times 10^5$ and $m(m-1)/2 = 179,999,700,000 \doteq 1.8 \times 10^{11}$

A Technique of 2-Opt Local Search

2-Opt Local Search (flip two edges)



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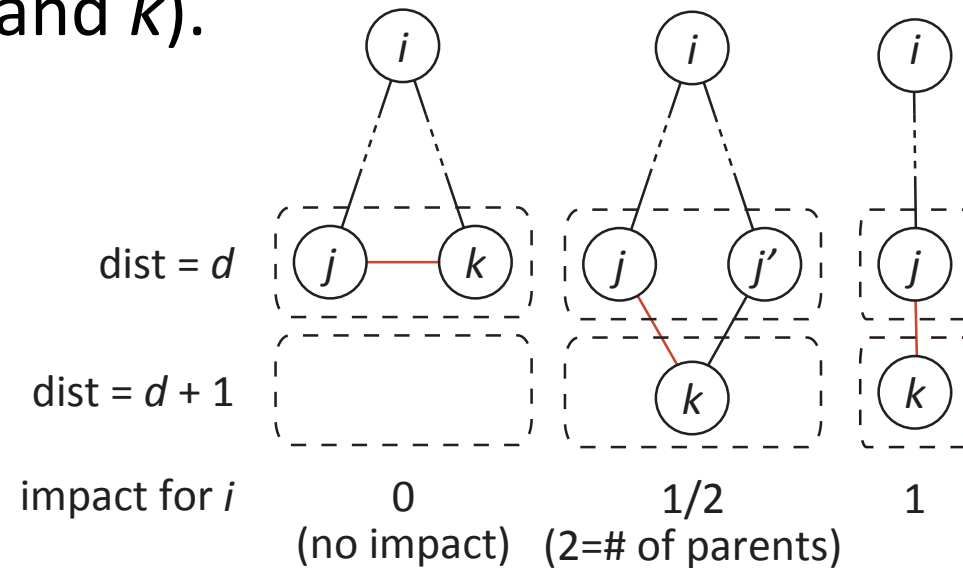
Möbius loop; $k=2$, $l=1.57$ (Gap 0.0%)

- Search space of 2-opt local search is very large.
- Question: which pair of edges is a better pair to shorten ASPL?
- An answer: lower important edges are given higher priority

A Technique of 2-Opt Local Search

Edge Importance for fast 2-OPT

- Rough definition: an edge (j, k) has a positive value for node i , if j and k is not the same distance from i . Importance of edge (j, k) is the sum of such values for all node i ($i \neq j$ and k).



- Calculate importance for all edges, sort them by importance.

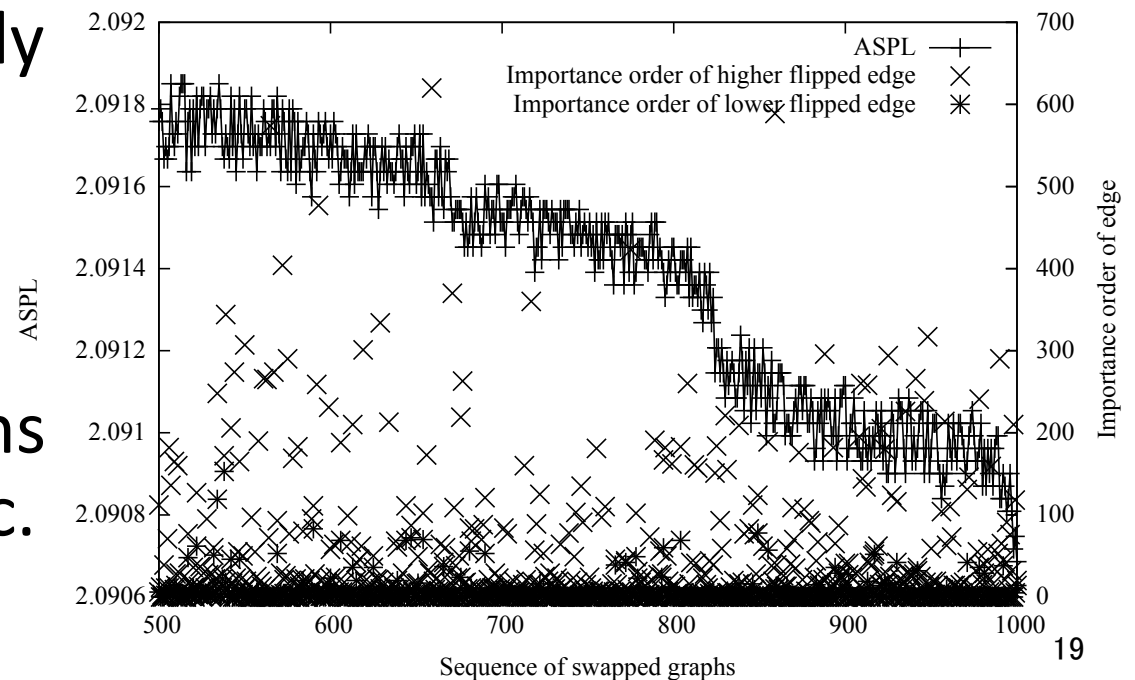
A Technique of 2-Opt Local Search

Application Results of Edge Importance

- In a graph of $n = 256$ and $d = 16$, there are 2048 edges and 2.1×10^6 edge pairs
- 1000 graphs are searched from $l = 2.09258$ to 2.09069 . In the sequence, we selected edge pair (i, j) from the range of $0 \leq i \leq 153$ and $1 \leq j \leq 620$.

The range contains only 4.6% of all edge pairs
($=154 * 621 / 2.1 \times 10^6$)

- Edge importance seems to be a valuable metric.



A Technique of 2-Opt Local Search

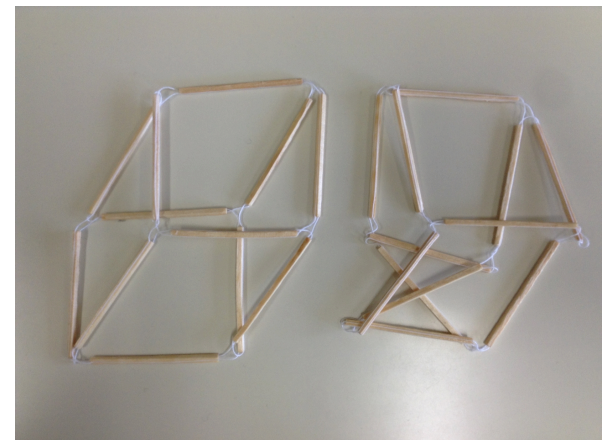
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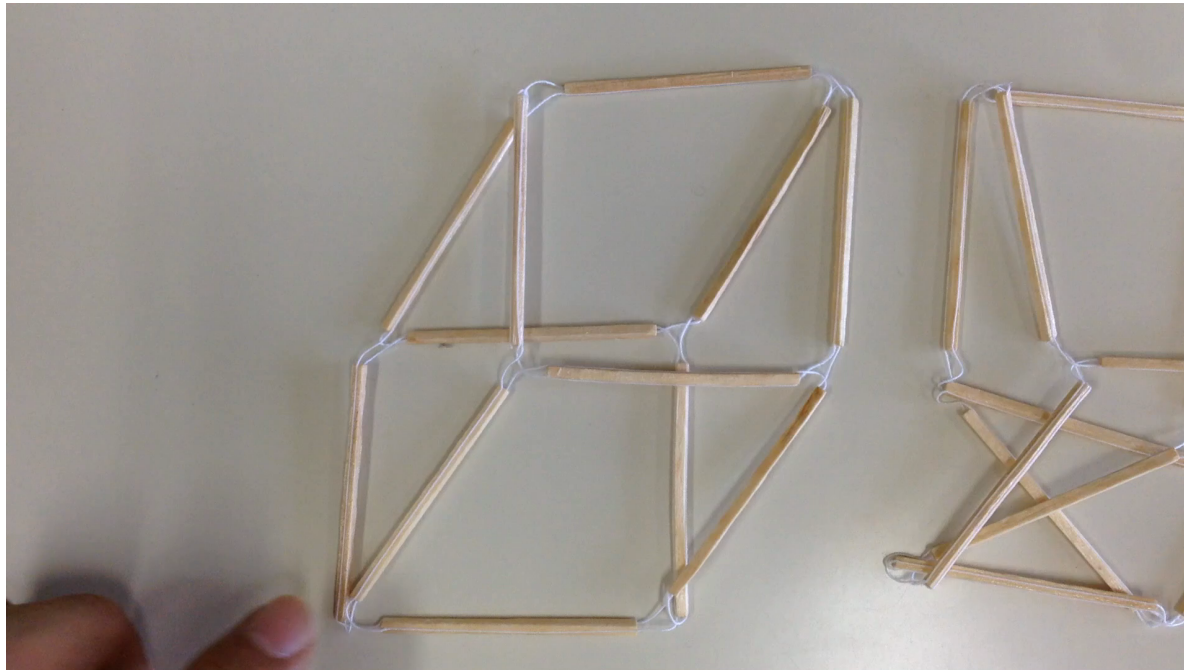
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Conclusion

- Explain our results, including graphs found after competition.
- Observing small order graphs, # of pentagon (5-node cycles) is a key property of diameter 3 graphs.
- Explain a heuristic algorithm for large diameter 3 graphs
 - ✓ *Create a Base Graph G_0 , Greedily Add Edges One by One to G_0*
- Explain a technique of 2-opt local search
 - ✓ *Edge Importance Function, Order of Local Search*
- *Physical handmade graphs (toys)*



Appendix: Physical Handmade Graphs



Cube

($k = 3, l = 1.71$)

Möbius loop
($k = 2, l = 1.57$)

