#### Divide-and-conquer Algorithms for Counting Paths using Zero-suppressed Binary Decision Diagrams

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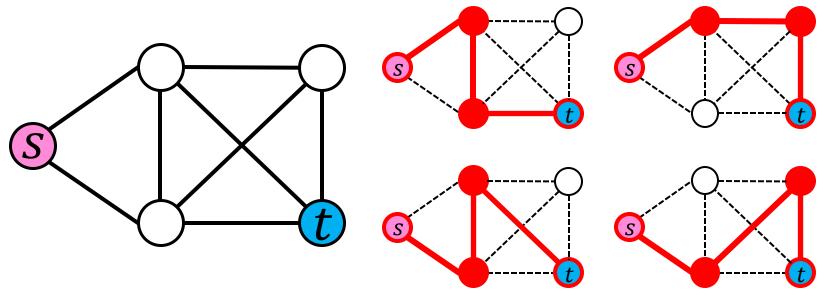
August 2, 2024



# Path-counting problem

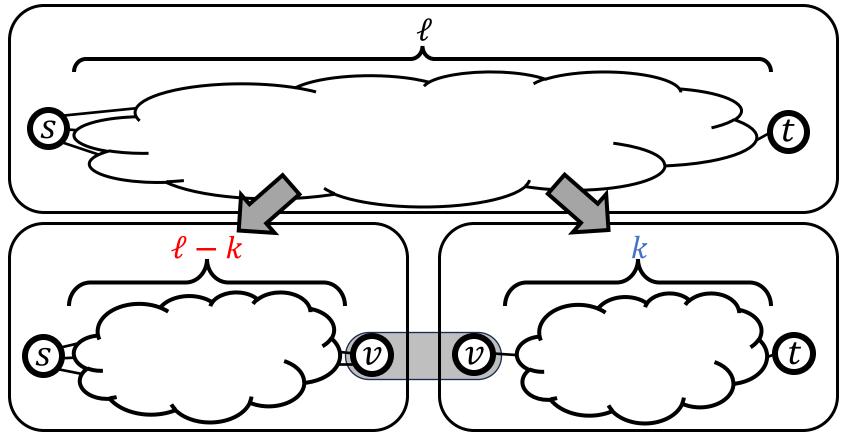
**Input:** A graph G(V, E), two terminals  $(s, t) \in V$ , and a nonnegative integer  $\ell$ 

**Question:** How many s-t paths of length  $\ell$  exists in G ?

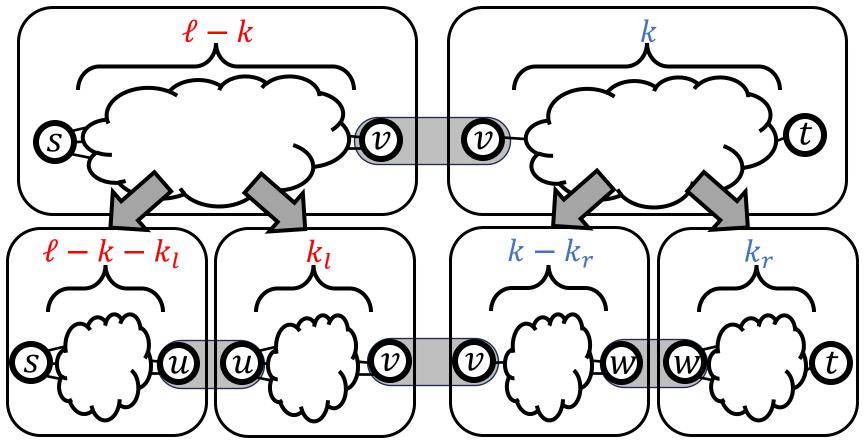


Lists of *s*-*t* paths of length 3

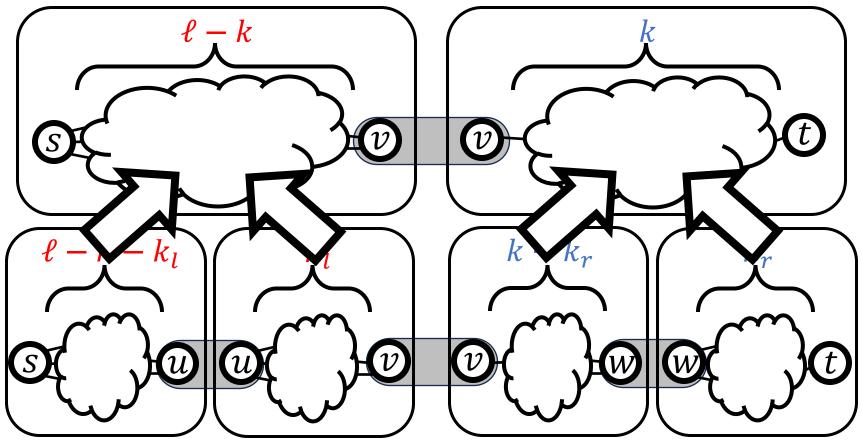
We divide the problem into sub-problems



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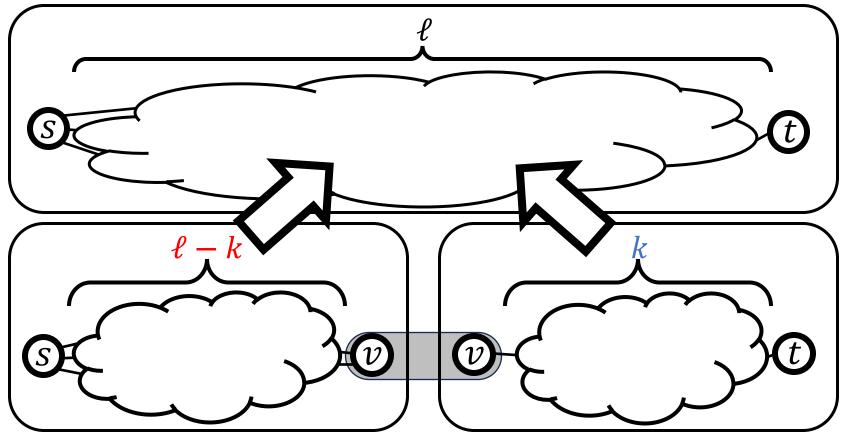


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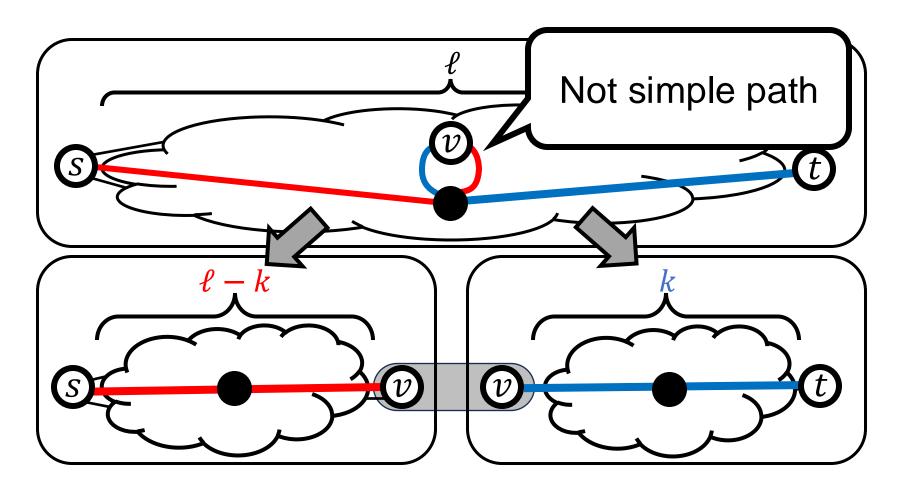


Multiple the number of paths

We divide the problem into sub-problems



Multiple the number of paths



Do not connect overlapping paths
→ Multiplication is imperfect for connecting paths

5

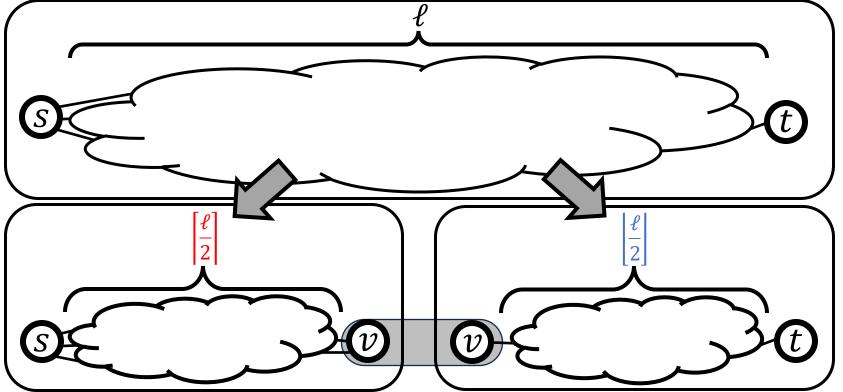
 There are performance differences due to the division length

- i. Half:  $\left(\left[\frac{\ell}{2}\right], \left[\frac{\ell}{2}\right]\right)$
- ii. Edge by edge:  $(\ell 1, 1)$
- iii. Hybrid of i and ii

Implement ZDD-based divide-and-conquer algorithm for the problem.

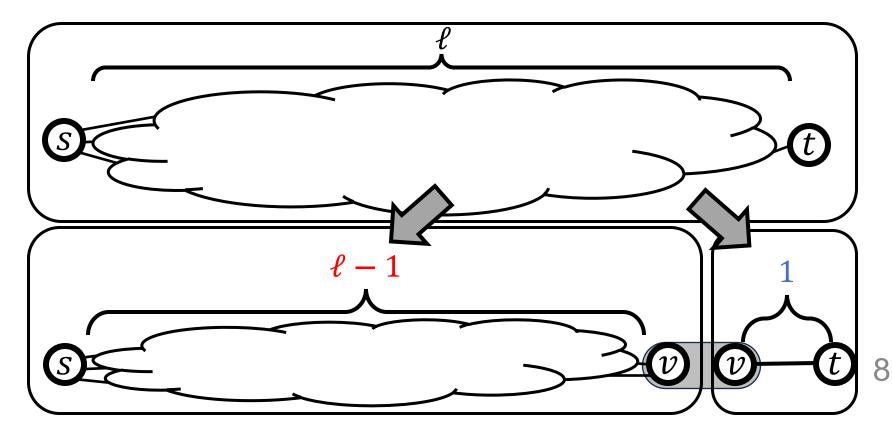
 There are performance differences due to the division length

i. Half: 
$$\left(\left\lceil \frac{\ell}{2} \right\rceil, \left\lceil \frac{\ell}{2} \right\rceil\right)$$



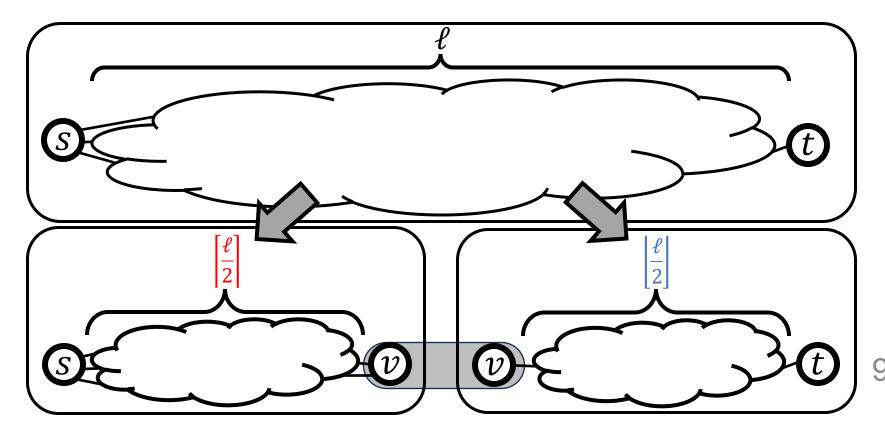
 There are performance differences due to the division length

ii. Edge by edge:  $(\ell - 1, 1)$ 



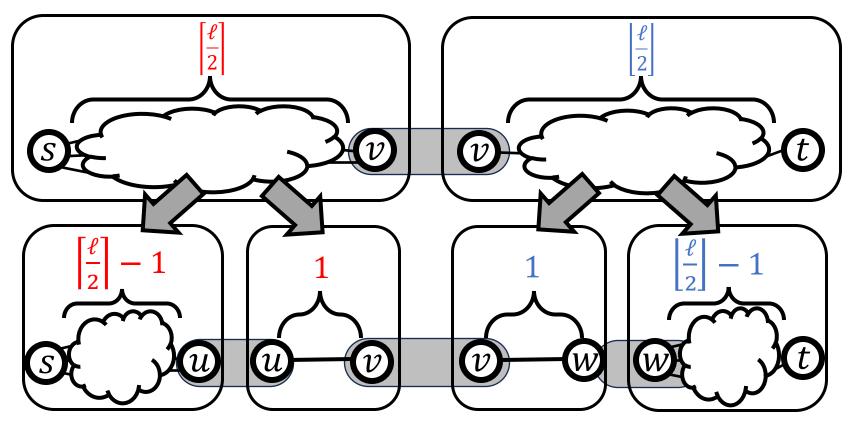
#### There are performance differences due to the division length

iii. Hybrid of i and ii



 There are performance differences due to the division length

iii. Hybrid of i and ii



 There are performance differences due to the division length

- i. Half:  $\left(\left[\frac{\ell}{2}\right], \left[\frac{\ell}{2}\right]\right)$
- ii. Edge by edge:  $(\ell 1, 1)$
- iii. Hybrid of 1 and 2

Implement ZDD-based divide-and-conquer algorithm for the problem.



ZDDs: Data structures representing families of sets compactly as directed graphs

[Example] Following ZDD representing  $S = \{\{c\}, \{a, b\}, \{b, c\}\}$ {a, b}



 $v \in V \setminus \{s,t\}$ 



ZDDs provide <u>efficient family algebraic</u> <u>operations</u>

*s*-*v* paths of v-*t* paths of length  $\ell - k$  length k

*s*-*t* paths of length *l* 

Not suitable for connecting only nonoverlapping paths

→ We propose a new operation "disjoint join"

# **Computational experiments**

**Input:** 100 instances (provided by ICGCA2023)

Timeout: 600 seconds / instance

#### Environment

# **CPU**: Intel Xeon CPU E5-2643 v4 (3.40 GHz, 24 cores)

**OS**: CentOS 7.9 Memory : 512GB

Library Our algorithms: SAPPOROBDD Mate-frontier method: TdZdd

- : timeout (600s)

	Running time[s]			
No.	Half	Edge	Hybrid	Mate- Frontier
022	0.69	36.28	0.49	-
025	-	-	-	212.25
061	1.67	50.84	1.38	-
073	2.53	145.74	1.50	-
085	-	119.57	-	-
089	171.23	-	137.13	-

There are performance differences due to the divide length

- : timeout (600s)

	Running time[s]			
No.	Half	Edge	Hybrid	Mate- Frontier
022	0.69	36.28	0.49	-
025	-	-	-	212.25
061	1.67	50.84	1.38	-
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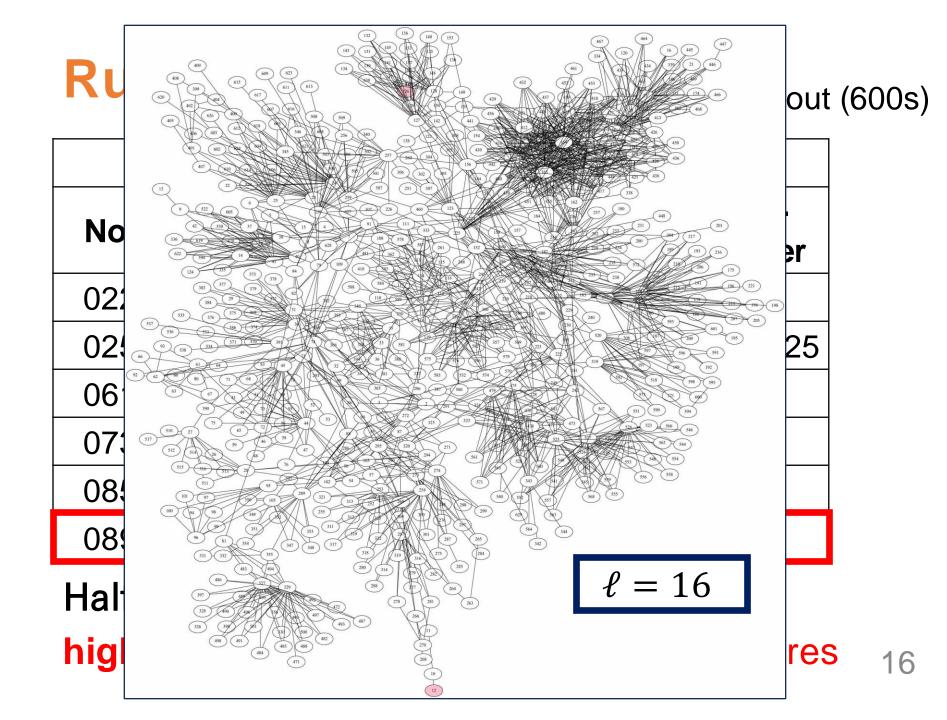
Hybrid calculates the fastest on half of instances.

- : timeout (600s)

	Running time[s]			
No.	Half	Edge	Hybrid	Mate- Frontier
022	0.69	36.28	0.49	-
025	-	-	-	212.25
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085	-	119.57	-	-
089	171.23	-	137.13	-

Half and Hybrid are solvable for

higher |E|/|V| ratio with clique-like structures

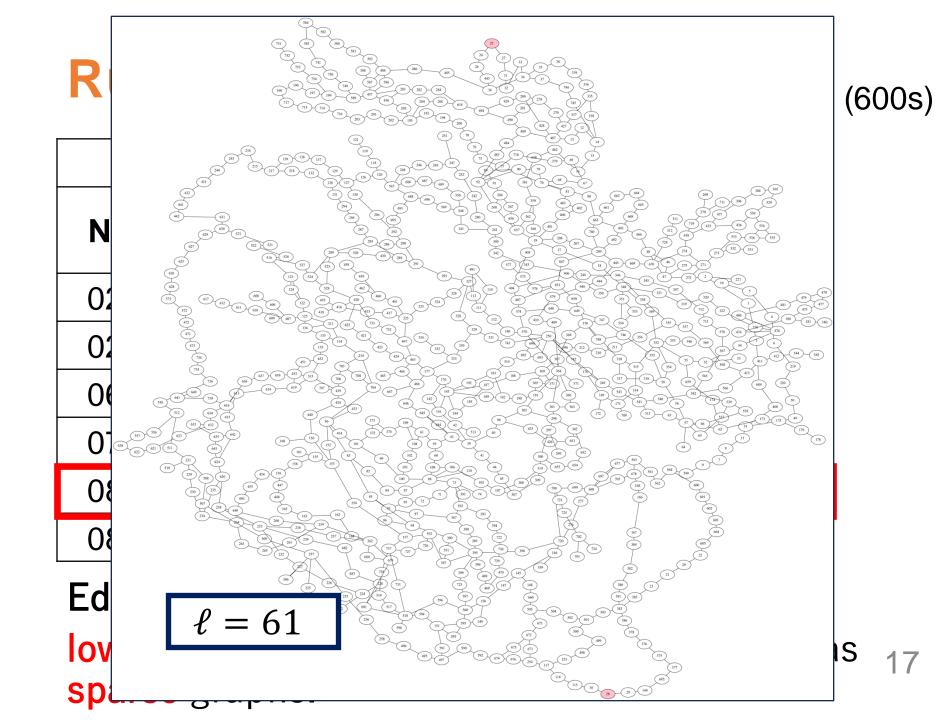


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Edge is solvable for

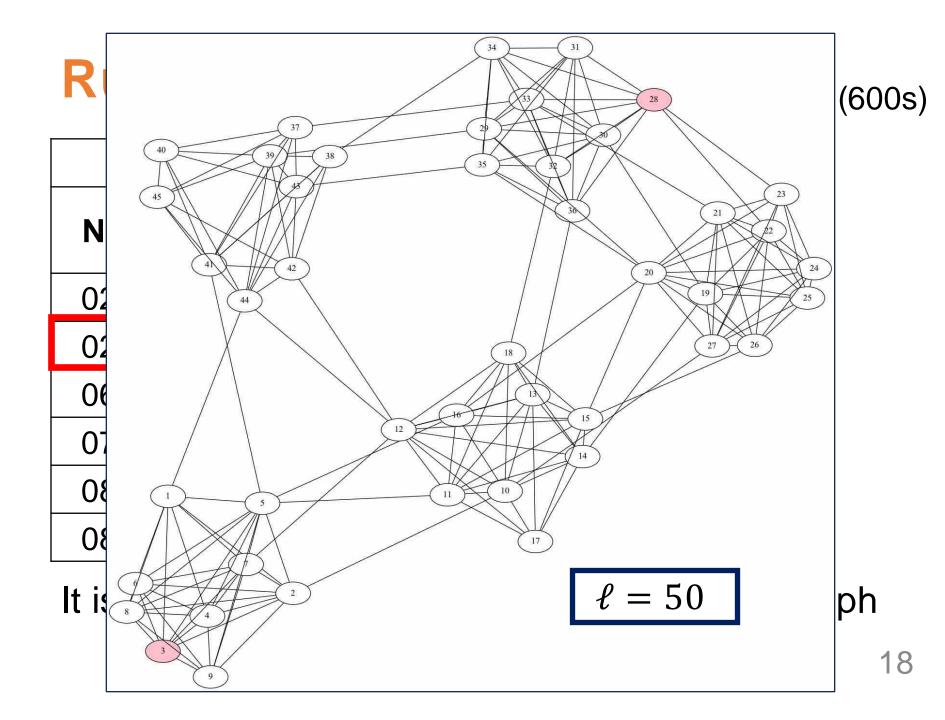
**lower** |E|/|V| ratio, which are characterized as 17 sparse graphs.



- : timeout (600s)

	Running time[s]			
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It is hard to calculate long path in densely graph



#### Conclusion

#### Implement ZDD-based divide-and-conquer algorithms for path-counting problem

 Observe the types of graph structures corresponding to division length

#### Future work:

More experiment with various characteristics (pathlength, pathwidth, maximum clique size, etc.)