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New Multiple Pairs Shortest Paths Algorithms

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Overview of this talk

- Path Algebra
- Review SSSP, APSP algorithms
 - SSSP: LC, LS
 - APSP: FW, Carré
- Propose 3 new MPSP algorithms
 - SLU
 - DLU1
 - DLU2
 - Implementation issues
- Discussion
 - General arc cost, Negative cycle
 - Complexity



Shortest Path Problem/Algorithm

- Single Source Shortest Path (SSSP)

- Nonnegative Arc Cost
- General Arc Cost

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- All Pairs Shortest Paths (APSP)

- Combinatorial Type Algorithms
- Algebraic Type Algorithms
- LP Type Algorithms

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- Multiple Pairs Shortest Paths (MPSP)

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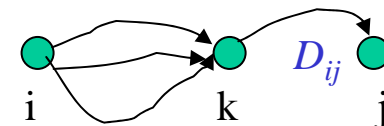
Path Algebra

- Problem: Given a measure matrix C
 - NO (1)multiple arcs, (2)loops ($C_{ii}=0$), (3)negative cycles
 - C_{ij} =arc length of (i,j) if it exists , or ∞ o.w.
 - What is the distance matrix D ?
 - D_{ij} =distance from i to j , or ∞ if i can't reach j
- Define path algebra

Original definition	$a \oplus b$	$a \otimes b$	e	$0(\text{Null})$
Path algebra	$\min\{a,b\}$	$a+b$	0	∞

$$D_{ij} = \begin{cases} \min_{k \neq i, j} (C_{ik} + D_{kj}) & , i \neq j \\ 0 & , i = j \end{cases}$$

$$\Leftrightarrow D = C \otimes D \oplus I_n$$





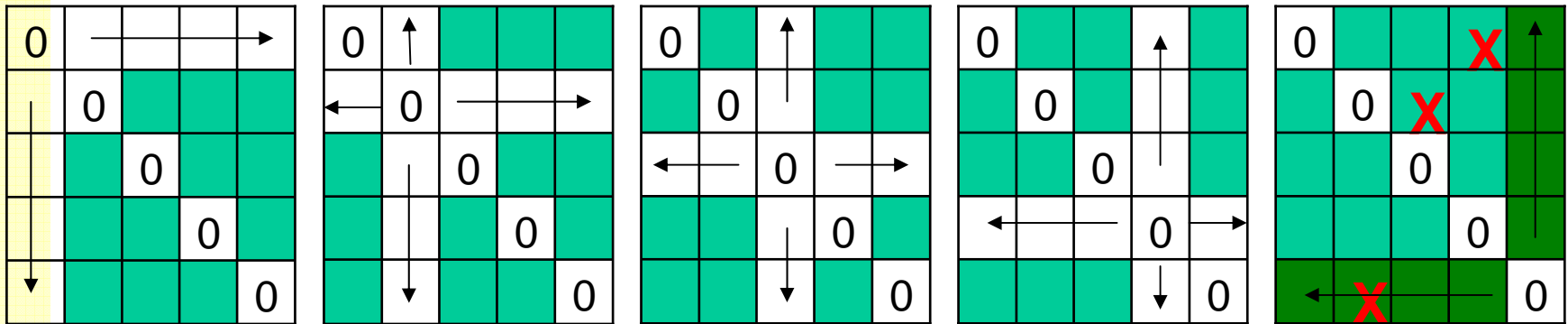
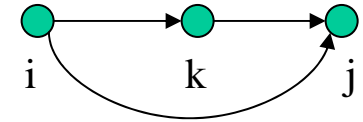
ALL-ALL SP Algorithm

- Solving $D = C \otimes D \oplus I_n$ is like solving system of linear equations
- Jacobi : Bellman-Ford $O(n^2m)$
- Gauss-Seidel : Ford-Fulkerson
- Gauss-Jordan : Floyd-Warshall Algorithm $O(n^3)$
- Gauss : $O(n^3)$: Carré , DLU
 - LU factorization (once)
 - forward elimination (for each node)
 - backward substitution (for each node)
 - Same # iterations as Floyd-Warshall, but can decompose to solve some-some shortest path problem



Floyd-Warshall Algorithm

- Idea: update C_{ij} by $\min\{C_{ij}, C_{ik} + C_{kj}\}$ where $k \neq i, j$
(triple comparison)



Total # triple comparison = $n(n-1)(n-2)$

It is $O(n^3) \rightarrow$ not good for sparse graph.

$Q = \{(1,4), (2,3), (5,2)\}$

Note:

- In the beginning of the last iteration, we already got optimal solution for $[n]$ -ALL and ALL- $[n]$



Illustration of Carré's Algorithm

$$\text{LU() } \frac{n(n-1)(n-2)}{3}$$

$$\text{Forward() } \frac{n(n-1)(n-2)}{6}$$

$$\text{Backward() } \frac{n(n-1)(n-2)}{2}$$

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ALL-[1]

ALL-[2]

(5,2)

ALL-[3]

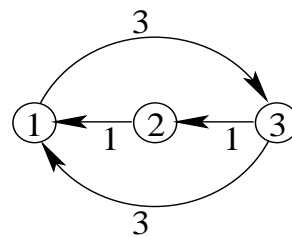
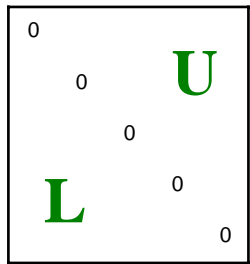
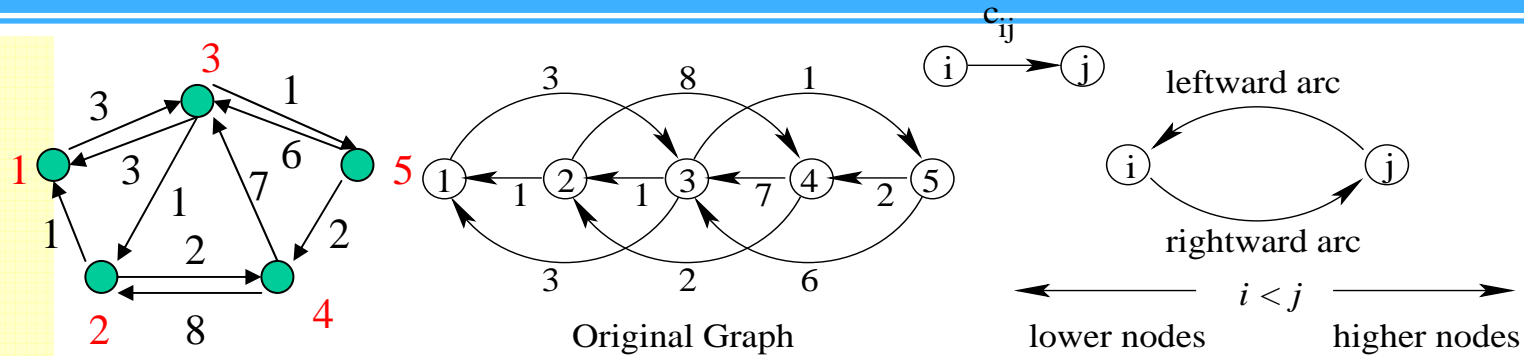
(2,3)

ALL-[4]

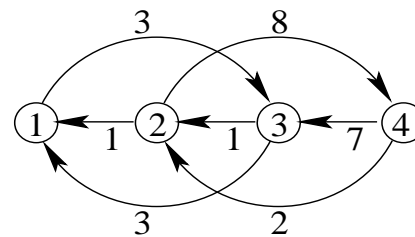
(1,4)

ALL-[5]

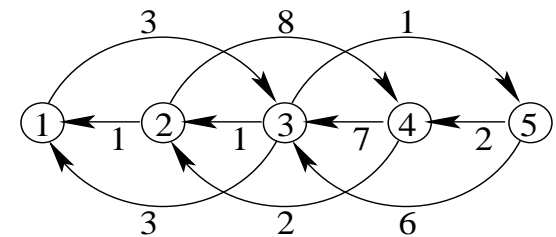
Definitions for Algorithm DLU



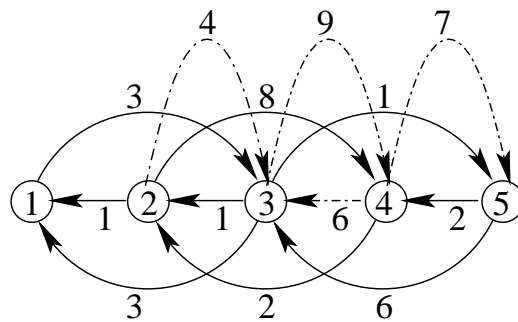
Subgraph $H([1,3])$



Subgraph $H([1,3]U4)$

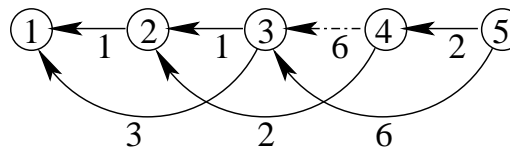


Subgraph $H([1,4]U5)$

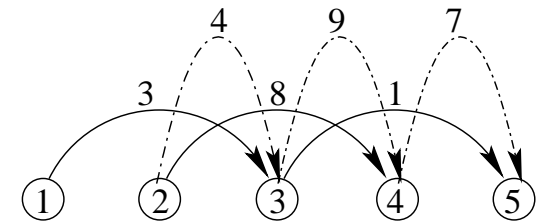


Augmented Graph G'

Dotted arcs have been added or modified



G'_L



G'_U



Algorithm $DLU_1(Q)$

- Get x_{st}^* for OD pairs (s,t) : $s \geq k_0$ $t \geq j_0$ or $s \geq i_0$ $t \geq i_0$
where $i_0 = \min_i s_i$, $j_0 = \min_i t_i$, $k_0 = \min_i \{\max\{s_i, t_i\}\}$

Algorithm $DLU_1(Q = \{(s_i, t_i), i=1, \dots, q\})$

begin

LU;

Acyclic_L(j_0);

Acyclic_U(i_0);

Reverse_LU(k_0);

end

0				X
	0	X		
		0		
			0	
	X			0

$Q := \{(s_i, t_i), i=1, \dots, q\}$

$i_0 = \min_i s_i$

$j_0 = \min_i t_i$

$k_0 = \min_i \{\max\{s_i, t_i\}\}$

$Q = \{(1,4), (2,3), (5,2)\}$

$i_0 = 1$

$j_0 = 2$

$k_0 = \min \{4, 3, 5\} = 3$

LU:

$\forall (s,t)$, get x_{st}^* in $H([1, \min\{s, t\}])$, construct Augmented Graph G'

Acyclic_L(j_0):

$\forall (s,t)$ $s > t \geq j_0$, get x_{st}^* in $H([1, s])$, compute shortest path in G'_L

Acyclic_U(i_0):

$\forall (s,t)$ $t > s \geq i_0$, get x_{st}^* in $H([1, t])$, compute shortest path in G'_U

Reverse_LU(k_0):

$\forall (s,t)$ satisfying $s \geq k_0$ $t \geq j_0$, or $s \geq i_0$ $t \geq i_0$
get x_{st}^* in $H([1, \max\{s, t\}] \cup r)$, $r = (\max\{s, t\} + 1), \dots, n$
compare with x_{st}^* obtained in $H([1, \max\{s, t\}])$, done!

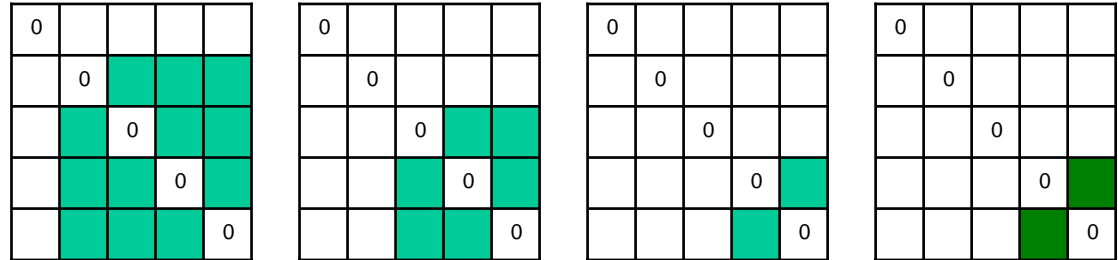


Operations of Algorithm DLU₁

ALL-ALL

$i_0=1, j_0=1, k_0=2$

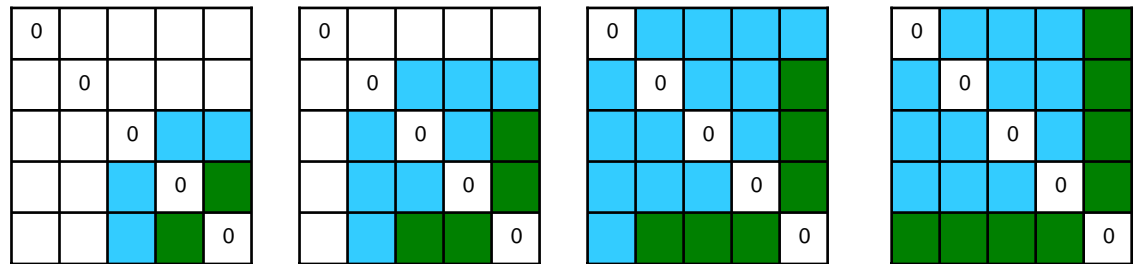
$$\text{LU} \quad \frac{n(n-1)(n-2)}{3}$$



Acyclic_L

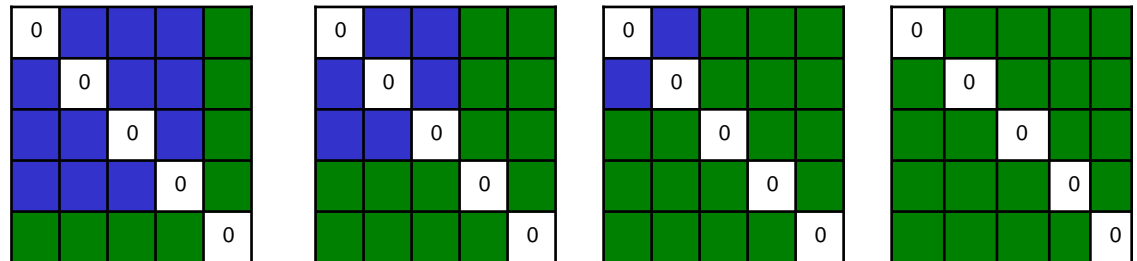
Acyclic_U

$$\frac{n(n-1)(n-2)}{3}$$



Reverse_LU

$$\frac{n(n-1)(n-2)}{3}$$











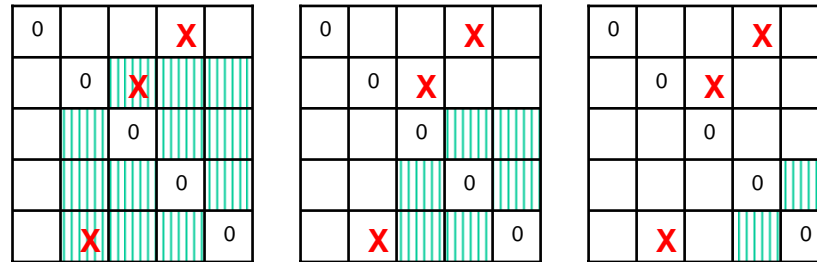
Example of Algorithm DLU_1

$Q = \{(1,4), (2,3), (5,2)\}$

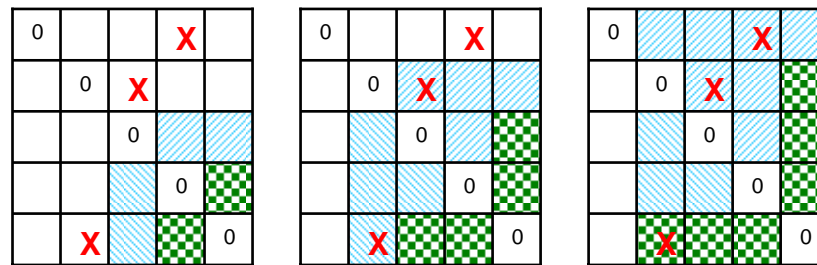
$i_0 = 1, j_0 = 2$

$k_0 = \min \{4, 3, 5\} = 3$

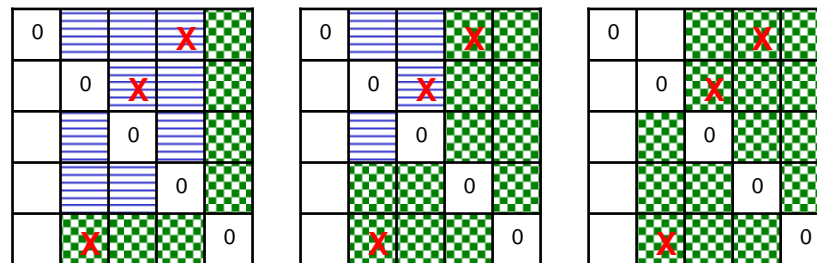
-  Requested OD pair
-  Updated entries by G_LU
-  Updated entries by $Acyclic_L$
-  Updated entries by $Acyclic_U$
-  Updated entries by $Reverse_LU$
-  Optimal entries



(a) Procedure G_LU



(b) Procedure $Acyclic_L(2)$ and $Acyclic_U(1)$



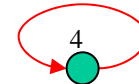
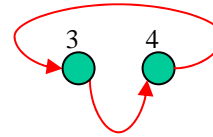
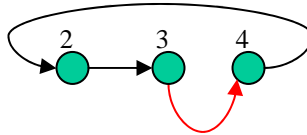
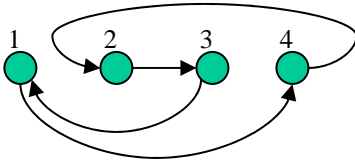
(c) Procedure $Reverse_LU(3)$



Properties of Algorithm DLU_1

Good:

- Efficient if only x_{st}^* are requested
(if need to trace paths, set $i_0=1$)
- Work for general arc costs, can detect any negative cycle



- A good node ordering decreases fill-in arcs
 - Preprocessing (Markowitz's rule, MMD, MND..etc)
- Save ½ storage/computation for undirected graphs.
- Acyclic graphs: same as topological ordering

Bad:

- Redundant work on unrequested OD pairs
- Difficulty to trace shortest path



Algorithm DLU_2

```
Algorithm  $DLU_2(Q=\{(s_i, t_i), i=1, \dots, q\})$   
begin  
  LU;  
  for  $i=1 \sim q$   
    Get_D( $s_i, t_i$ );  
    if  $x^*_{s_i, t_i} \neq \infty$  & need to trace path  
      Get_P( $s_i, t_i$ );  
end
```

- attacks requested OD pairs directly
- fewer operations than DLU_1
- easier to trace path






```
Procedure  $Get\_D(s_i, t_i)$   
begin  
  Get_D_L( $t_i$ );  
  Get_D_U( $s_i$ );  
  Min_add( $s_i, t_i$ );  
end
```

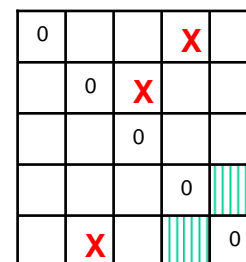
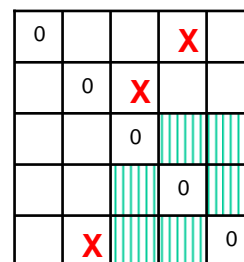
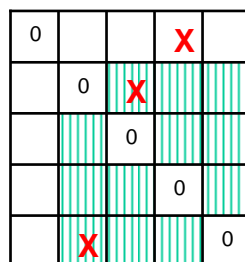
```
Procedure  $Get\_P(s_i, t_i)$   
begin  
  let  $k := succ_{s_i, t_i}$   
  while  $k \neq t_i$  do  
    Get_D( $k, t_i$ );  
    let  $k := succ_{s_i, t_i}$   
  end
```



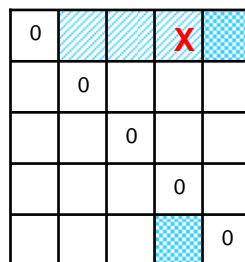
Example of Algorithm DLU_2

$Q=\{(1,4),(2,3),(5,2)\}$

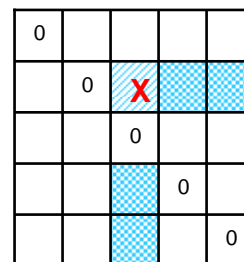
-  Requested OD pair
-  Updated entries by G_{LU}
-  Updated entries by Get_D_L
-  Updated entries by Get_D_U
-  Updated entries by Min_add



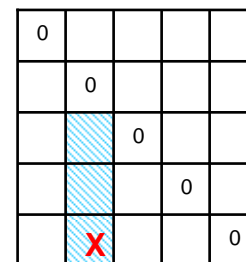
(a) Procedure G_{LU}



$Get_D(1,4)$

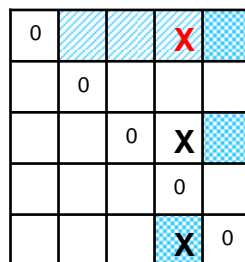


$Get_D(2,3)$

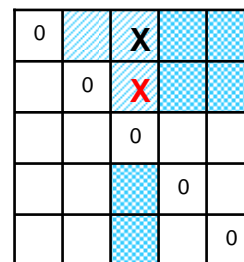


$Get_D(5,2)$

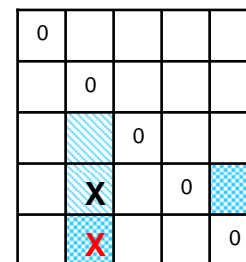
(b) Procedure $Get_D(s,t)$



$Get_P(1,4)$



$Get_P(2,3)$









$Get_P(5,2)$

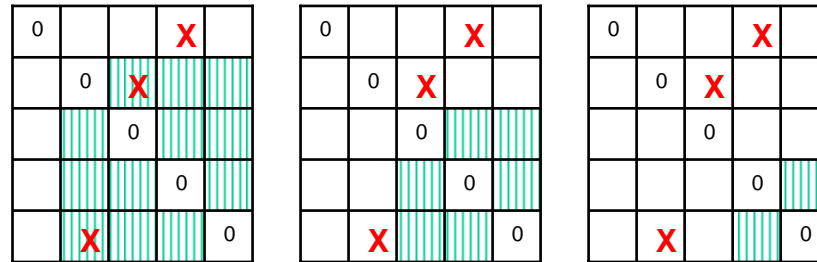
$1 \rightarrow 3 \rightarrow 5 \rightarrow 4$

$2 \rightarrow 1 \rightarrow 3$

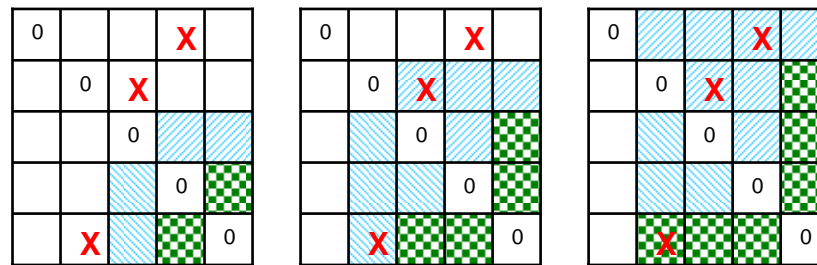
$5 \rightarrow 4 \rightarrow 2$


 $Q = \{(1,4), (2,3), (5,2)\}$
 $i_0 = 1, j_0 = 2$
 $k_0 = \min \{4, 3, 5\} = 3$

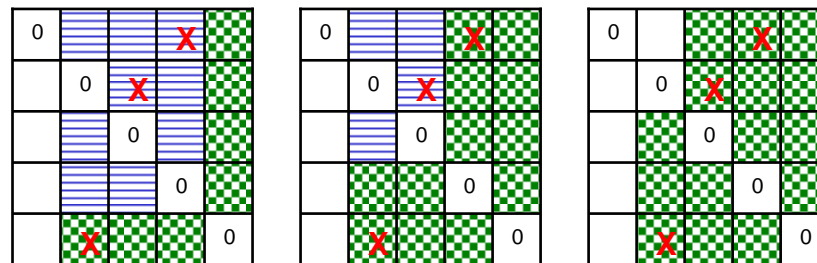
-  Requested OD pair
-  Updated entries by *G_LU*
-  Updated entries by *Acyclic_L*
-  Updated entries by *Acyclic_U*
-  Updated entries by *Reverse_LU*
-  Optimal entries



(a) Procedure *G_LU*



(b) Procedure *Acyclic_L(2)* and *Acyclic_U(1)*



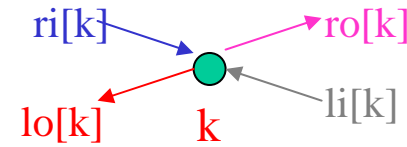
(c) Procedure *Reverse_LU(3)*



Example of Algorithm DLU_2

SOME-SOME

$Q=\{(1,4),(2,3),(5,2)\}$



0				
	0			
				0

LU

0				X
	0			
				0

0				X
	0			
				0

0				X
	0			
				0

0				X
	0			
				0

$O(\sum ro(k)li(k))$

Get_D(1,4)

0				X
	0			
				0

Get_D(2,3)

0				
	0			
				0

Get_D(5,2)

0				
	0			
				0

$O(\min\{q \cdot nnz(LU), n^3\})$

Get_P(1,4)

0				X
	0			
				0

Get_D(2,3)

0				
	0			
				0

Get_D(5,2)

0				
	0			
				0

1-3-5-4

2-1-3

5-4-2



Implementation

- Preprocess: 8 pivot rules (MKZ(S,D),MMD,MND,...)
- SLU_1 : sparse implementation of Carré's Algorithm
 - Code generation (e.g.: $n=1000, m=6000, 500MB \rightarrow 200MB \rightarrow 5MB \rightarrow 0MB!$)
 - Bucket(slu11) , 1 heap(slu12) , 2 heaps(slu13)
- SLU_2 : sparse implementation of Algorithm DLU_2
 - Bucket(slu21) , 1 heap(slu22)

Compare with: (Cherkassky et al. 1996 Math.Program.)

- gor1 , bfp , thresh , pape , two-q , dikh , dikbd , dikr , dikba

Test cases:

- 4 network generators: spgrid , sprand , netgen , gridgen
- 3 OD generators



Results & Conclusion

- Computational Results:
 - Depend on topology , node ordering , OD pairs
 - In general can not beat Cherkassky et al.
 - Markowitz's rule usually gives better ordering
 - Definitely much better than Floyd-Warshall Algorithm
- Conclusion:
 - Simple , efficient for SOM-SOME shortest paths
 - 'Ad hoc' code , exploits properties of graphs
 - Theoretically suitable for dense graphs
 - Need more storages ($O(n^2)$)
 - Complexity $O(\sum_{k=1 \sim n} \text{ro}(k) \text{li}(k) + \min\{q * \text{nnz}(\text{LU}), n^3\})$
 - Iterative methods([stability](#)) vs. direct methods([sparsity](#))



Thank you

- Questions ?

- Contact

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Industrial & System Engineering (ISyE)

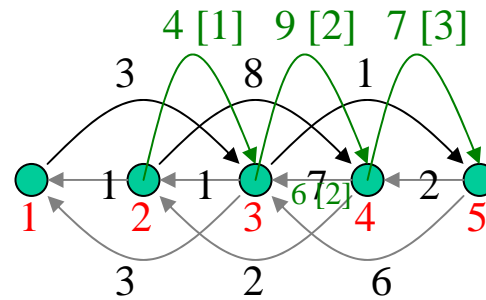
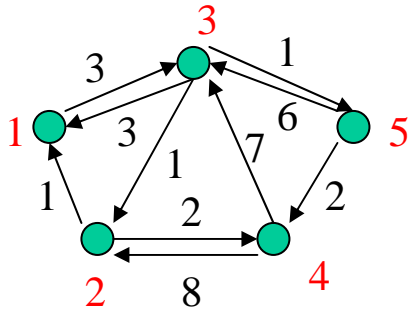
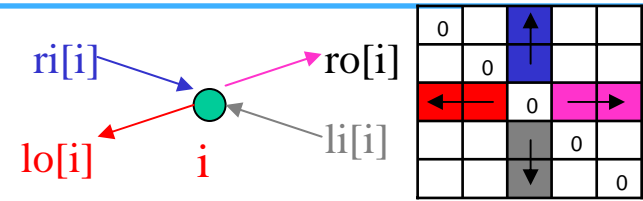
Georgia Institute of Technology (GA Tech)



Example of Algorithm SLU_1

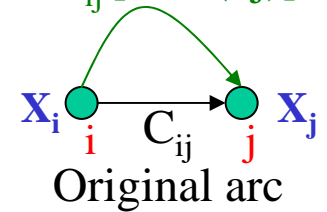
- Augmented Graph:

- Graph obtained by **LU** operations

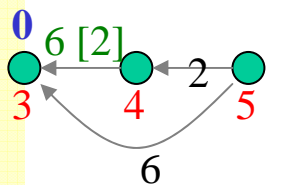


Augmented Graph

Artificial arc
 $C_{ij}[\text{succ}(i,j)]$

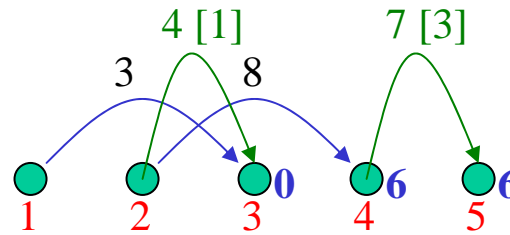


- e.g. ALL-[3]



Forward(3)

Node i	3	4	5
X_i	0	6	6
succ(i)	-	2	3



Backward(1)

Node i	1	2	4	5
X_i	3	4	6	6
succ(i)	3	1	2	3