

# 算法设计与分析 Algorithms Design & Analysis

## 第十二讲：单源最短路径

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## 最短路径问题(Shortest Path Problems)

- How can we find the shortest route between two points on a map?(如何确定地图上两个地点的最短路径?)
- Model the problem as a graph problem(模型:图的算法问题):
  - Road map is a weighted graph: (路线地图→有权图)
  - vertices = cities (城市→顶点)
  - edges = road segments between cities(路线→边)
  - edge weights = road distances(路程→边的权)
  - Goal: find a shortest path between two vertices (cities) (目标:确定两顶点之间的最短路径)

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## 最短路径问题(Shortest Path Problems)

### Input:(输入)

- Directed graph  $G = (V, E)$  (有向图G)
- Weight function  $w: E \rightarrow \mathbf{R}$  (权)

### Weight of path $p = \langle v_0, v_1, \dots, v_k \rangle$

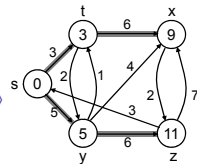
(路径权的定义)

$$w(p) = \sum_{i=1}^k w(v_{i-1}, v_i)$$

### Shortest-path weight from $u$ to $v$ : (最短路径的权)

$$\delta(u, v) = \begin{cases} \min w(p) : u \xrightarrow{p} v & \text{if there exists a path from } u \text{ to } v \\ \infty & \text{otherwise} \end{cases}$$

- Shortest path  $u$  to  $v$  is any path  $p$  such that  $w(p) = \delta(u, v)$  ( $u$  到  $v$  的最短路径是满足  $w(p) = \delta(u, v)$  的路径, 不唯一)



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## 最短路径的不同形式(Variants of Shortest Paths)

### Single-source shortest path(单源最短路径)

- $G = (V, E) \Rightarrow$  find a shortest path from a given source vertex  $s$  to each vertex  $v \in V$  (从给定的源顶点  $s$  到图中其他顶点  $v \in V$  的最短路径)

### Single-destination shortest path(单目的地最短路径)

- Find a shortest path to a given destination vertex  $t$  from each vertex  $v$  (图中的顶点  $v \in V$  到某个给定的目的顶点  $t$  的最短路径)
- Reverse the direction of each edge  $\Rightarrow$  single-source (反向图, 演变为单源最短路径问题)

### Single-pair shortest path (单点对最短路径问题)

- Find a shortest path from  $u$  to  $v$  for given vertices  $u$  and  $v$  (给定两顶点  $u$  和  $v$ , 求  $u$  到  $v$  的最短路径)
- Solve the single-source problem (是单源最短路径问题的一个子问题)

### All-pairs shortest-paths (全点对最短路径问题)

- Find a shortest path from  $u$  to  $v$  for every pair of vertices  $u$  and  $v$  (图中所有点对之间的最短距离)

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## 最短路径的优化基础 (Optimal Substructure of Shortest Paths)

Given:给定

- A weighted, directed graph  $G = (V, E)$  (有权有向图)
- A weight function  $w: E \rightarrow \mathbf{R}$ , (权函数)
- A shortest path  $p = \langle v_1, v_2, \dots, v_k \rangle$  from  $v_1$  to  $v_k$  ( $v_1$  到  $v_k$  的最短路径  $p$ )
- A subpath of  $p$ :  $p_{ij} = \langle v_i, v_{i+1}, \dots, v_j \rangle$ , with  $1 \leq i \leq j \leq k$  ( $p$  的部分路径  $p_{ij}$ )

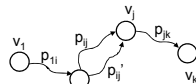
Then:  $p_{ij}$  is a shortest path from  $v_i$  to  $v_j$  (部分路径是最短路径)

Proof:  $p = v_1 \dots v_i \dots v_j \dots v_k$

$$w(p) = w(p_{1i}) + w(p_{ij}) + w(p_{jk})$$

Assume  $\exists p'_{ij}$  from  $v_i$  to  $v_j$  with  $w(p'_{ij}) < w(p_{ij})$  (反证法)

$\Rightarrow w(p') = w(p_{1i}) + w(p'_{ij}) + w(p_{jk}) < w(p)$  contradiction!



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## 权值为负的边(Negative-Weight Edges)

- $s \rightarrow a$ : only one path (唯一路径)

$$\delta(s, a) = w(s, a) = 3$$

- $s \rightarrow b$ : only one path (唯一路径)

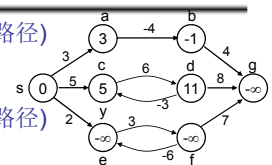
$$\delta(s, b) = w(s, a) + w(a, b) = -1$$

- $s \rightarrow c$ : infinitely many paths (无穷路径)

$$\langle s, c \rangle, \langle s, c, d, c \rangle, \langle s, c, d, c, d, c \rangle$$

cycle has positive weight (6 - 3 = 3) (回路的权 > 0)

$\langle s, c \rangle$  is shortest path with weight  $\delta(s, c) = w(s, c) = 5$  (最短路径)

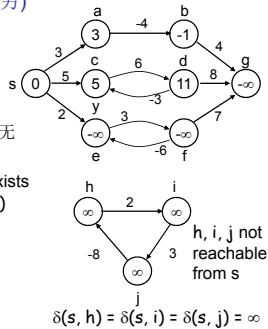


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## 权值为负的边(Negative-Weight Edges)

### • $s \rightarrow e$ : infinitely many paths(无穷)

- $\langle s, e \rangle, \langle s, e, f, e \rangle, \langle s, e, f, e, f, e \rangle$
- cycle  $\langle e, f, e \rangle$  has negative weight:  
 $3 + (-6) = -3$  (回路的权 $<0$ )
- can find paths from  $s$  to  $e$  with arbitrarily large negative weights (无穷大负权)
- $\delta(s, e) = -\infty \Rightarrow$  no shortest path exists between  $s$  and  $e$  (不存在最短路径)
- Similarly:  $\delta(s, f) = -\infty, \delta(s, g) = -\infty$



$$\delta(s, h) = \delta(s, i) = \delta(s, j) = \infty$$

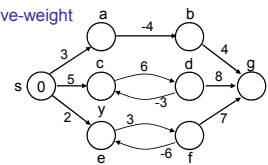
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## 权值为负的边(Negative-Weight Edges)

- Negative-weight edges may form negative-weight cycles(负权边可能形成负权回路)
- If such cycles are reachable from the source:  $\delta(s, v)$  is not properly defined

(如果从源顶点 $s$ 能够到达负权回路的顶点 $v$ ,则有:  $w(s, v) = -\infty$ )

- Keep going around the cycle, and get  $w(s, v) = -\infty$  for all  $v$  on the cycle



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## 回路(Cycles)

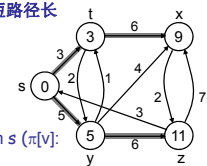
- Can shortest paths contain cycles? (最短路径可否含有回路)
- Negative-weight cycles(负权回路) No!
- Positive-weight cycles(正权回路) No!
  - By removing the cycle we can get a shorter path (如有移除, 将产生更短的路径)
- Zero-weight cycles(权为0的回路)
  - No reason to use them (没有合理的理由在最短路径中包含它们)
  - Can remove them to obtain a path with similar weight(移除不会对最短路径的权产生任何影响)
- We will assume that when we are finding shortest paths, the paths will have no cycles(所以,最短路径不含有任何回路)

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## 最短路径表示法(Shortest-Path Representation)

For each vertex  $v \in V$ : (对于任何一个顶点  $v \in V$ )

- $d[v] = \delta(s, v)$ : a shortest-path estimate (对最短路径长度的估计  $d[v] = \delta(s, v)$ )
  - Initially,  $d[v] = \infty$  (初值)
  - Reduces as algorithms progress (算法过程中逐步减少)
- $\pi[v]$  = predecessor of  $v$  on a shortest path from  $s$  ( $\pi[v]$ : 从源顶点 $s$ 到顶点 $v$ 的最短路径上 $v$ 的前辈顶点)
  - If no predecessor,  $\pi[v] = \text{NIL}$  (如果没有前辈顶点,  $\pi[v] = \text{NIL}$ )
  - $\pi$  induces a tree—shortest-path tree (形成树)
- Shortest paths & shortest path trees are not unique (最短路径和最短路径树不是唯一的)



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## 初始化算法(Initialization)

*Alg.*: INITIALIZE-SINGLE-SOURCE( $V, s$ )

1. for each  $v \in V$
2. do  $d[v] \leftarrow \infty$
3.  $\pi[v] \leftarrow \text{NIL}$
4.  $d[s] \leftarrow 0$

- All the shortest-paths algorithms start with INITIALIZE-SINGLE-SOURCE (所有的最短路径算法都以初始化开始)

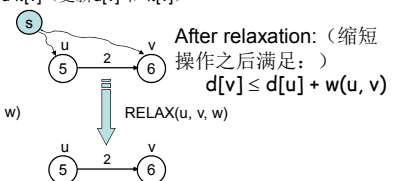
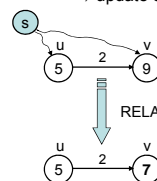
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## 缩短法(Relaxation)

- Relaxing an edge  $(u, v)$  = testing whether we can improve the shortest path to  $v$  found so far by going through  $u$  (所谓对边  $(u, v)$  的缩短, 即是检查能否通过顶点  $u$ , 改善已有的到达  $v$  的最短路径)

If  $d[v] > d[u] + w(u, v)$  (如果满足  $d[v] > d[u] + w(u, v)$ )  
we can improve the shortest path to  $v$  (则可以改进抵达  $v$  的最短路径)

$\Rightarrow$  update  $d[v]$  and  $\pi[v]$  (更新  $d[v]$  和  $\pi[v]$ )



After relaxation: (缩短操作之后满足: )  
 $d[v] \leq d[u] + w(u, v)$

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## RELAX算法 (RELAX(u, v, w))

1. if  $d[v] > d[u] + w(u, v)$
  2. then  $d[v] \leftarrow d[u] + w(u, v)$
  3.  $\pi[v] \leftarrow u$
- All the single-source shortest-paths algorithms (所有单源最短路径算法)
    - start by calling INIT-SINGLE-SOURCE (从初始化学法开始)
    - then relax edges (然后是缩短算法)
  - The algorithms differ in the order and how many times they relax each edge (算法之间的差别在于缩短算法的执行顺序和次数)

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## Bellman-Ford 算法

- Single-source shortest paths problem (单源最短路径问题)
  - Computes  $d[v]$  and  $\pi[v]$  for all  $v \in V$  (计算顶点  $v \in V$  的  $d[v]$  和  $\pi[v]$ )
- Allows negative edge weights (允许负权值边)
- Returns: (返回值)
  - TRUE if no negative-weight cycles are reachable from the source  $s$  (如果从源顶点  $s$  没有可抵达的负权值回路, 返回‘真’)
  - FALSE otherwise  $\Rightarrow$  no solution exists (其余的返回‘假’, 无解)
- Idea: (思想)
  - Traverse all the edges  $|V| - 1$  times, every time performing a relaxation step of each edge (遍历所有的边  $|V| - 1$  次, 每次对每条边执行一次缩短运算)

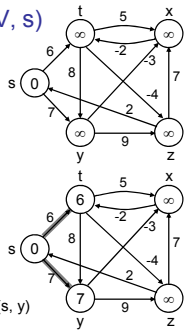
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## BELLMAN-FORD( $V, E, w, s$ )

1. INITIALIZE-SINGLE-SOURCE( $V, s$ )
2. for  $i \leftarrow 1$  to  $|V| - 1$
3. do for each edge  $(u, v) \in E$
4. do RELAX( $u, v, w$ )
5. for each edge  $(u, v) \in E$
6. do if  $d[v] > d[u] + w(u, v)$
7. then return FALSE
8. return TRUE

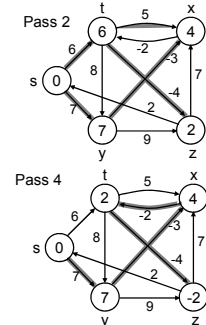
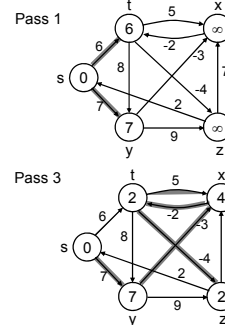
$E: (t, x), (t, y), (t, z), (x, t), (y, x), (y, z), (z, x), (z, s), (s, t), (s, y)$

$|V| - 1$  次边搜索的顺序,



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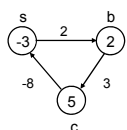
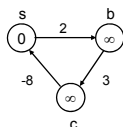
$(t, x), (t, y), (t, z), (x, t), (y, x), (y, z), (z, x), (z, s), (s, t), (s, y)$



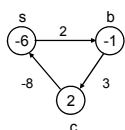
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## 回路检测(Detecting Negative Cycles)

- for each edge  $(u, v) \in E$
- do if  $d[v] > d[u] + w(u, v)$
- then return FALSE
- return TRUE



执行  $|V| - 1$  次缩短运算



Look at edge  $(s, b)$ : (对于边  $(s, b)$ )

$$d[b] = -1$$

$$d[s] + w(s, b) = -4$$

$$\Rightarrow d[b] > d[s] + w(s, b)$$

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## 分析: BELLMAN-FORD( $V, E, w, s$ )

1. INITIALIZE-SINGLE-SOURCE( $V, s$ )  $\leftarrow \Theta(V)$
2. for  $i \leftarrow 1$  to  $|V| - 1$   $\leftarrow O(V)$
3. do for each edge  $(u, v) \in E$   $\leftarrow O(E)$
4. do RELAX( $u, v, w$ )  $\leftarrow O(E)$
5. for each edge  $(u, v) \in E$   $\leftarrow O(E)$
6. do if  $d[v] > d[u] + w(u, v)$
7. then return FALSE
8. return TRUE

Running time:  $O(VE)$  (运行开销)

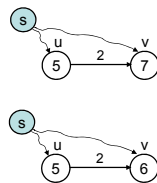
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## 最短路径特性(Shortest Path Properties)

- **Triangle inequality (三角不等式)**

For all  $(u, v) \in E$ , we have:

$$\delta(s, v) \leq \delta(s, u) + w(u, v)$$



- If  $u$  is on the shortest path to  $v$  we have the equality sign (如果顶点 $u$ 在抵达 $v$ 的最短路径上, 等号成立)

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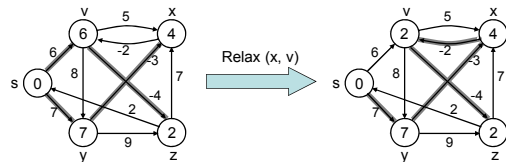
## 最短路径特性(Shortest Path Properties)

- **Upper-bound property(上限特性)**

We always have  $d[v] \geq \delta(s, v)$  for all  $v$ . (对于任何顶点 $v$ ,  $d[v] \geq \delta(s, v)$  成立)

Once  $d[v] = \delta(s, v)$ , it never changes. (一旦 $d[v] = \delta(s, v)$ 成立,  $d[v]$  便不再改变)

- The estimate never goes up – relaxation only lowers the estimate (对距离 $d[v]$ 的估计不会变大, 缩短操作只会缩小距离 $d[v]$ 的估计)



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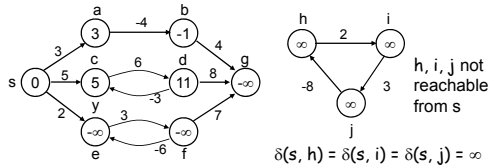
## 最短路径特性(Shortest Path Properties)

- **No-path property(无通路特性)**

If there is no path from  $s$  to  $v$  then  $d[v] = \infty$  always.

如果不存在从 $s$ 到 $v$ 的通路, 则有 $d[v] = \infty$

- $\delta(s, h) = \infty$  and  $d[h] \geq \delta(s, h) \Rightarrow d[h] = \infty$  (例)



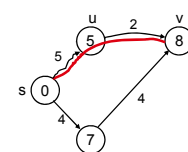
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## 最短路径特性(Shortest Path Properties)

- **Convergence property**

If  $s \rightsquigarrow u \rightarrow v$  is a shortest path, and if  $d[u] = \delta(s, u)$  at any time prior to relaxing edge  $(u, v)$ , then  $d[v] = \delta(s, v)$  at all times afterward.

(如果 $s \rightsquigarrow u \rightarrow v$ 是一条最短路径, 在对边 $(u, v)$ 进行缩短操作之前的任何时刻有 $d[u] = \delta(s, u)$ , 那么在对边 $(u, v)$ 进行缩短操作之后的任何时刻有 $d[v] = \delta(s, v)$ 。)

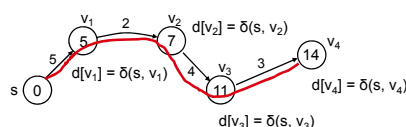


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## 最短路径特性(Shortest Path Properties)

- **Path relaxation property**

Let  $p = \langle v_0, v_1, \dots, v_k \rangle$  be a shortest path from  $s = v_0$  to  $v_k$ . If we relax, in order,  $(v_0, v_1), (v_1, v_2), \dots, (v_{k-1}, v_k)$ , even intermixed with other relaxations, then  $d[v_k] = \delta(s, v_k)$ . ( $p = \langle v_0, v_1, \dots, v_k \rangle$  是从源顶点 $v_0$ 到 $v_k$ 的最短路径, 如果缩短操作是按照 $(v_0, v_1), (v_1, v_2), \dots, (v_{k-1}, v_k)$ 进行的, 即使其中有其他缩短操作穿插,  $d[v_k] = \delta(s, v_k)$ 成立)



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## DAG的单源最短路径(Single-Source Shortest Paths in DAGs)

- Given a weighted DAG:  $G = (V, E)$

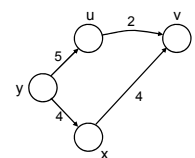
– solve the shortest path problem (给出DAG:  $G = (V, E)$ , 求最短路径)

- **Idea: (思想)**

- Topologically sort the vertices of the graph (对图进行拓扑排序)
- Relax the edges according to the order given by the topological sort (依据拓扑排序对边进行缩短操作)
  - for each vertex, we relax each edge that starts from that vertex (对于每一个顶点, 对始于该顶点的每条边进行缩短操作)

- Are shortest-paths well defined in a DAG?

- Yes, (negative-weight) cycles cannot exist (DGA中没有负权值回路, 因此存在最短路径)



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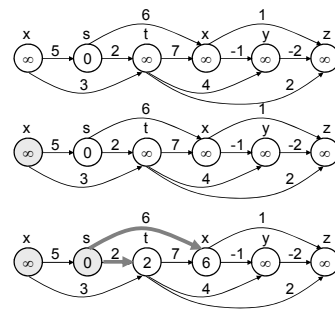
## DAG-SHORTEST-PATHS( $G, w, s$ )

1. topologically sort the vertices of  $G$  (拓扑排序)  $\leftarrow \Theta(V+E)$
2. INITIALIZE-SINGLE-SOURCE( $V, s$ ) (初始化)  $\leftarrow \Theta(V)$
3. **for** each vertex  $u$ , taken in topologically sorted order (依据拓扑排序顶点顺序)  $\leftarrow \Theta(V)$
4.     **do for** each vertex  $v \in \text{Adj}[u]$  (对邻接边进行缩短操作)  $\leftarrow \Theta(E)$
5.         **do** RELAX( $u, v, w$ )

Running time:  $\Theta(V+E)$

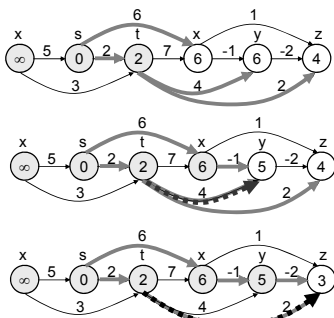
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## Example



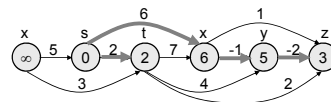
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## Example (cont.)



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## Example (cont.)



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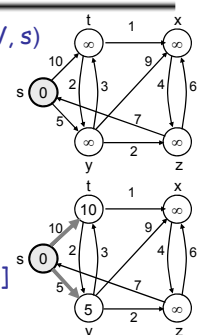
## Dijkstra's 算法

- Single-source shortest path problem: (单源最短路径)
  - No negative-weight edges:  $w(u, v) > 0 \forall (u, v) \in E$  (不存在负权值边)
- Maintains two sets of vertices: (两类顶点的集合)
  - $S$  = vertices whose final shortest-path weights have already been determined ( $S$ : 集中中顶点的最短路径已经确定)
  - $Q$  = vertices in  $V - S$ : min-priority queue ( $Q$ :  $V - S$ , 极小优先队列)
    - Keys in  $Q$  are estimates of shortest-path weights ( $d[v]$ ) ( $Q$ 中的值是最短路径的估计)
- Repeatedly select a vertex  $u \in V - S$ , with the minimum shortest-path estimate  $d[u]$  (重复的从 $Q$ 中选择具有最短估计距离的顶点进行处理)

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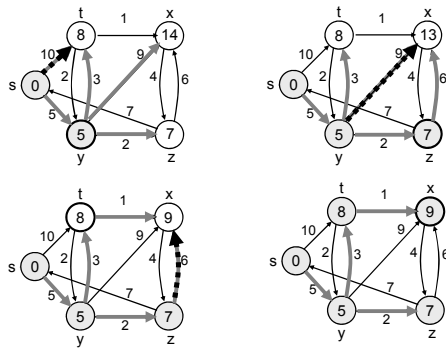
## Dijkstra ( $G, w, s$ )

1. INITIALIZE-SINGLE-SOURCE( $V, s$ )
2.  $S \leftarrow \emptyset$
3.  $Q \leftarrow V[G]$
4. **while**  $Q \neq \emptyset$
5.     **do**  $u \leftarrow \text{EXTRACT-MIN}(Q)$
6.          $S \leftarrow S \cup \{u\}$
7.         **for** each vertex  $v \in \text{Adj}[u]$
8.             **do** RELAX( $u, v, w$ )



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## Example



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