

# PostgreSQL优化器浅析

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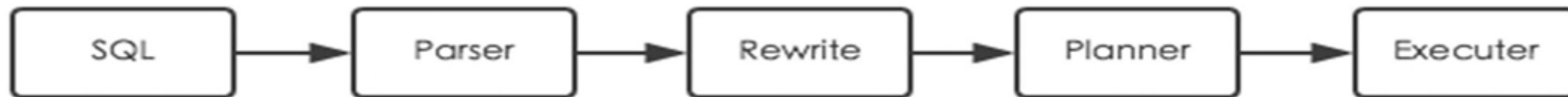
# 目录

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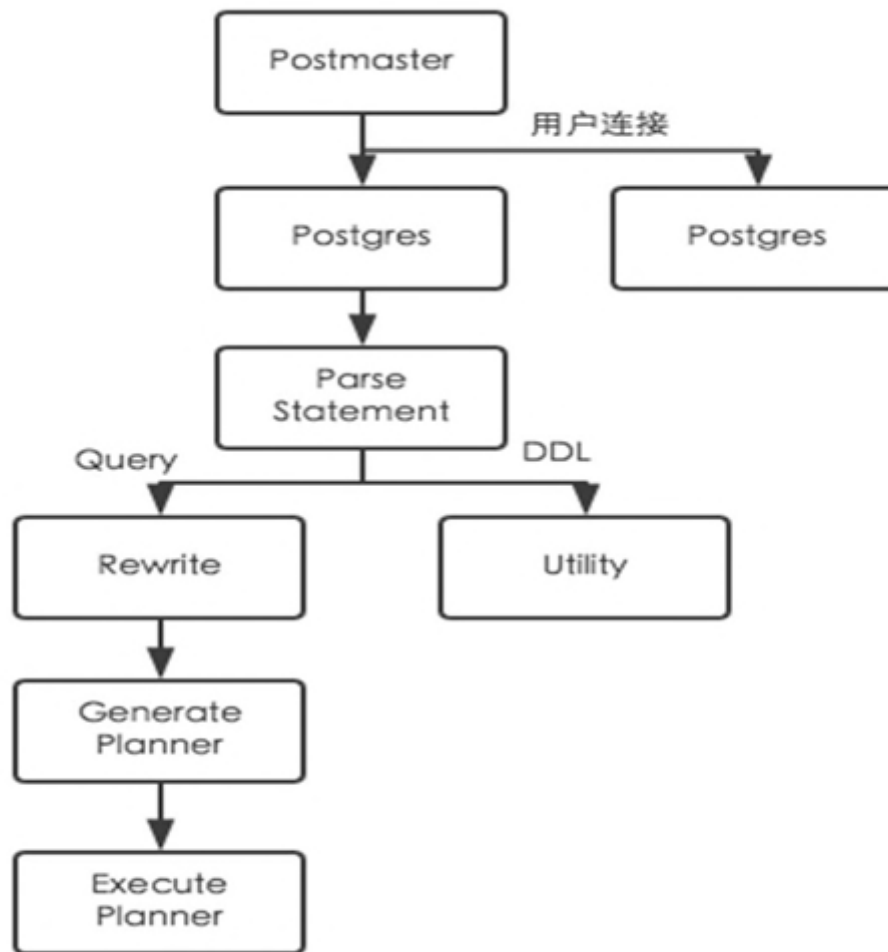
- 优化器介绍
- 逻辑优化
- 物理优化

# 优化器介绍

- 什么是优化器
  - 数据库的大脑
  
- SQL处理过程



# 优化器介绍



# 优化器介绍

- 查看优化器生成计划
  - explain query, 如下

```
postgres=# explain select * from test where id = 10 limit 1;
```

```
QUERY PLAN
```

---

```
Limit (cost=0.28..8.29 rows=1 width=4)
```

```
  -> Index Only Scan using test11 on test (cost=0.28..8.29 rows=1 width=4)
```

```
        Index Cond: (id = 10)
```

```
(3 rows)
```

# 优化器介绍

- Plan结构

```
{PLANNEDSTMT
:commandType 1
:queryId 0
:hasReturning false
:hasModifyingCTE false
:canSetTag true
:transientPlan false
:planTree
  {LIMIT
  :startup_cost 0.28
  :total_cost 8.29
  :plan_rows 1
  :plan_width 4
  :targetlist (
    {TARGETENTRY
    :expr
      {VAR
      :varno 65001
      :varattno 1
      :vartype 23
      :vartypmod -1
      :varcollid 0
      :varlevelsup 0
      :varnoold 1
      :varoattno 1
      :location -1
      }
      :resno 1
      :resname id
      :ressortgroupref 0
      :resorigtbl 16398
      :resorigcol 1
      :resjunk false
      }
    )
  :qual <
  :lefttree
  {INDEXONLYSCAN
  :startup_cost 0.28
  :total_cost 8.29
  :plan_rows 1
  :plan_width 4
```

```
:targetlist (
  {TARGETENTRY
  :expr
    {VAR
    :varno 65002
    :varattno 1
    :vartype 23
    :vartypmod -1
    :varcollid 0
    :varlevelsup 0
    :varnoold 1
    :varoattno 1
    :location 7
    }
    :resno 1
    :resname id
    :ressortgroupref 0
    :resorigtbl 16398
    :resorigcol 1
    :resjunk false
    }
  )
:qual <
:lefttree <
:righttree <
:initPlan <
:extParam (b)
:allParam (b)
:scanrelid 1
:indexid 24594
:indexqual (
  {OEXPR
  :opno 96
  :opfuncid 65
  :opresulttype 16
  :opretset false
  :opcollid 0
  :inputcollid 0
  :args (
    {VAR
    :varno 65002
    :varattno 1
```

# 逻辑查询优化

- 什么是逻辑优化
  - 主要对SQL进行等价或者推倒变换，让其达到更好的执行计划
- 主要优化方向
  - 避免重复工作
  - 减少子集数据量

# 逻辑查询优化

## • SQL组成

```
SELECT s.name  
FROM score sc, student s  
WHERE s.no IN  
(SELECT st_no FROM class c  
WHERE c.name = '1101')  
AND sc.st_no = s.no  
ORDER BY sc.score DESC  
LIMIT 1;
```

target list

range table

qualifier

IN-clause subquery

Join predicate

sort order

limit expression



# 逻辑查询优化

- 查询重写

- 消除view、rule等

```
create view v_t_1_2 as SELECT t1.a1, t1.b1, t2.a2, t2.b2 FROM t1, t2;
```

```
postgres=> explain select * from v_t_1_2, t1 where v_t_1_2.a1 = 10 and t1.b1 = 20;  
QUERY PLAN
```

```
-----  
Nested Loop (cost=0.55..41.59 rows=1000 width=24)  
  -> Nested Loop (cost=0.55..16.60 rows=1 width=16)  
    -> Index Scan using t1_a1_key on t1 t1_1 (cost=0.28..8.29 rows=1 width=8)  
        Index Cond: (a1 = 10)  
    -> Index Scan using b1_1 on t1 (cost=0.28..8.29 rows=1 width=8)  
        Index Cond: (b1 = 20)  
  -> Seq Scan on t2 (cost=0.00..15.00 rows=1000 width=8)  
(7 rows)
```

view又被重写回原来的  
query

## • 提升子链

### • 将IN和exists子句递归提升

`select * from t1 where t1.a1 in (select t2.a2 from t2 where t2.b2 = 10);` 假设t2.a2为unique

转化为:

`select t1.a1, t1.a2 from t1 join t2 where t1.a1=t2.a2 and t2.b2 = 10;`

执行计划如下:

```
postgres=> explain select * from t1 where t1.a1 in (select t2.a2 from t2 where t2.b2 = 10);
          QUERY PLAN
```

```
-----
Nested Loop  (cost=0.28..25.80 rows=1 width=8)
  -> Seq Scan on t2  (cost=0.00..17.50 rows=1 width=4)
      Filter: (b2 = 10)
  -> Index Scan using t1_a1_key on t1  (cost=0.28..8.29 rows=1 width=8)
      Index Cond: (a1 = t2.a2)
```

## • 提升子链

`explain select * from t1 where exists (select t2.a2 from t2 where t2.a2 = t1.a1) ;` 假设t2.a2为unique  
转化为:

```
select t1.a1, t1.b1 from t1, t2 where t1.a1=t2.a1;
```

执行计划如下:

```
postgres=> explain select * from t1 where exists (select t2.a2 from t2 where t2.a2 = t1.a1) ;
```

QUERY PLAN

---

Hash Join (cost=26.42..54.69 rows=952 width=8)

Hash Cond: (t2.a2 = t1.a1)

-> Seq Scan on t2 (cost=0.00..15.00 rows=1000 width=4)

-> Hash (cost=14.52..14.52 rows=952 width=8)

    -> Seq Scan on t1 (cost=0.00..14.52 rows=952 width=8)

(5 rows)

## • 提升子链

### • 部分IN和exists子句不能提升

```
postgres=> explain select * from t1 where t1.a1 in (select t2.a2 from t2 where t1.b1 = 10);  
QUERY PLAN
```

```
-----  
Seq Scan on t1 (cost=0.00..8349.28 rows=476 width=8)  
  Filter: (SubPlan 1)  
    SubPlan 1  
      -> Result (cost=0.00..15.00 rows=1000 width=4)  
            One-Time Filter: (t1.b1 = 10)  
              -> Seq Scan on t2 (cost=0.00..15.00 rows=1000 width=4)  
(6 rows)
```

这里也是可以优化的，  
把t1.b1移到父查询，  
但是PG没有支持

这里IN子句中使用了主查询的表字段，和主查询有相关性

## • 提升子查询

- 子查询和子链接区别：子查询是不在表达式中的子句，子链接在表达式中的子句

```
select * from t1, (select * from t2) as c where t1.a1 = c.a2;
```

转化为：

```
select * from t1, t2 where t1.a1 = t2.a2;
```

```
postgres=> explain select * from t1, (select * from t2) as c where t1.a1 = c.a2;
```

QUERY PLAN

-----  
Hash Join (cost=26.42..54.69 rows=952 width=16)

Hash Cond: (t2.a2 = t1.a1)

-> Seq Scan on t2 (cost=0.00..15.00 rows=1000 width=8)

-> Hash (cost=14.52..14.52 rows=952 width=8)

-> Seq Scan on t1 (cost=0.00..14.52 rows=952 width=8)

(5 rows)

## • 提升子查询

### • 同样子查询也有不支持的情况

```
postgres=> explain select t1.a1 from t1, (select a2 from t2 limit 1) as c where c.a2 = 10;
```

QUERY PLAN

---

Nested Loop (cost=0.00..24.07 rows=952 width=4)

-> Subquery Scan on c (cost=0.00..0.03 rows=1 width=0)

Filter: (c.a2 = 10)

-> Limit (cost=0.00..0.01 rows=1 width=4)

-> Seq Scan on t2 (cost=0.00..15.00 rows=1000 width=4)

-> Seq Scan on t1 (cost=0.00..14.52 rows=952 width=4)

(6 rows)

1. 没有集合操作
2. 没有聚合操作
3. 不包含  
sort/limit/with/group
4. 没有易失函数
5. from非空

.....

## • 化简条件

规则	化简前	化简后
常量传递	<code>a1=a2 and a2=100</code>	<code>a1=100 and a2=100</code>
表达式计算	<code>a1=1+2</code>	<code>a1=3</code>
去除多余括号	<code>(a and b) and (c and d)</code>	<code>a and b and c and d</code>
简化or	<code>false or a &gt; 1</code>	<code>a &gt; 1</code>

## • 外连接消除 (left/right/full join)

以left join为例，left join(左连接) 返回包括左表中的所有记录和右表中连接字段相等的记录，如果右表没有匹配的记录，那么右表将会以NULL值代替，例如：

A表	B表
ID1	ID2
1	1
2	

```
select * from A left join B on A.id1 = B.id2;
```

结果如下：

ID1	ID2
1	1
2	NULL



- 外连接消除(left/right/full join)

```
postgres=> explain select * from t1 left join t2 on true;  
          QUERY PLAN
```

---

```
Nested Loop Left Join (cost=0.00..11932.02 rows=952000 width=16)  
  -> Seq Scan on t1 (cost=0.00..14.52 rows=952 width=8)  
  -> Materialize (cost=0.00..20.00 rows=1000 width=8)  
      -> Seq Scan on t2 (cost=0.00..15.00 rows=1000 width=8)
```

(4 rows)

```
postgres=> explain select * from t1 left join t2 on true where t1.a1 = t2.a2;  
          QUERY PLAN
```

---

```
Hash Join (cost=26.42..54.69 rows=952 width=16)  
Hash Cond: (t2.a2 = t1.a1)  
  -> Seq Scan on t2 (cost=0.00..15.00 rows=1000 width=8)  
  -> Hash (cost=14.52..14.52 rows=952 width=8)  
      -> Seq Scan on t1 (cost=0.00..14.52 rows=952 width=8)
```

(5 rows)

## • 外连接消除条件

- where和join条件保证右表不会有NULL值的行产生

```
postgres=> explain select * from t1 left join t2 on t1.b1 = t2.b2 where t2.b2 is not NULL;
```

### QUERY PLAN

---

**Nested Loop** (cost=0.28..23.30 rows=1 width=16)

-> Seq Scan on t2 (cost=0.00..15.00 rows=1 width=8)

Filter: (b2 IS NOT NULL)

-> Index Scan using b1\_1 on t1 (cost=0.28..8.29 rows=1 width=8)

Index Cond: (b1 = t2.b2)

(5 rows)

## • 条件下推

- 为了连接前，元组数组尽量少

```
postgres=> explain select * from t1,t2 where t1.a1 < 10 and t2.a2 > 900;
```

```
QUERY PLAN
```

---

```
Nested Loop (cost=0.55..31.20 rows=1000 width=16)
```

```
-> Index Scan using t2_a2_key on t2 (cost=0.28..10.03 rows=100 width=8)
```

```
Index Cond: (a2 > 900)
```

```
-> Materialize (cost=0.28..8.70 rows=10 width=8)
```

```
-> Index Scan using t1_a1_key on t1 (cost=0.28..8.65 rows=10 width=8)
```

```
Index Cond: (a1 < 10)
```

## • 语义优化

### • 约束优化

```
create table tt1(id int not null);  
postgres=> explain select * from tt1 where id is null;  
                QUERY PLAN
```

---

```
Seq Scan on tt1 (cost=0.00..15407.02 rows=1 width=15)  
  Filter: (id IS NULL)
```

```
set constraint_exclusion = on;
```

```
postgres=> explain select * from tt1 where id is null;  
                QUERY PLAN
```

---

```
Result (cost=0.00..0.01 rows=1 width=0)  
  One-Time Filter: false
```

默认未优化

## • MIN/MAX

```
select min(a1) from t1;
```

转换为:

```
select a1 from t1 order by a1 limit 1;
```

如果a1没有索引, 那么将会是全表扫描

```
postgres=> explain select min(a1) from t1;
```

QUERY PLAN

---

Result (cost=0.32..0.33 rows=1 width=0)

InitPlan 1 (returns \$0)

-> Limit (cost=0.28..0.32 rows=1 width=4)

-> Index Only Scan using t1\_a1\_key on t1 (cost=0.28..45.09 rows=952 width=4)

Index Cond: (a1 IS NOT NULL)

## group by 优化

```
create index tt1_id_key on tt1 using btree ( id );  
postgres=> explain select id from tt1 group by id;  
QUERY PLAN
```

---

```
Group (cost=0.42..33891.21 rows=1000102 width=4)  
Group Key: id  
-> Index Only Scan using tt1_id_key on tt1 (cost=0.42..31390.96 rows=1000102 width=4)  
(3 rows)
```

```
postgres=> explain select name from tt1 group by name;  
QUERY PLAN
```

---

```
Group (cost=132169.76..137170.27 rows=1000102 width=11)  
Group Key: name  
-> Sort (cost=132169.76..134670.02 rows=1000102 width=11)  
Sort Key: name  
-> Seq Scan on tt1 (cost=0.00..15407.02 rows=1000102 width=11)  
(5 rows)
```

## • order by 优化

### 1. 利用索引消除order by

```
postgres=> explain select * from t1 order by a1;
```

QUERY PLAN

---

```
Index Scan using t1_a1_key on t1 (cost=0.28..42.71 rows=952 width=8)
(1 row)
```

### 2. order by 下推

```
postgres=> explain select * from t1, t2 where t1.b1=t2.b2 order by b1;
```

QUERY PLAN

---

```
Merge Join (cost=126.45..136.22 rows=1 width=16)
  Merge Cond: (t1.b1 = t2.b2)
    -> Sort (cost=61.62..64.00 rows=952 width=8)
        Sort Key: t1.b1
        -> Seq Scan on t1 (cost=0.00..14.52 rows=952 width=8)
    -> Sort (cost=64.83..67.33 rows=1000 width=8)
        Sort Key: t2.b2
        -> Seq Scan on t2 (cost=0.00..15.00 rows=1000 width=8)
(8 rows)
```

## distinct 优化

```
postgres=> explain select distinct(a1) from t1;  
                QUERY PLAN
```

```
-----  
HashAggregate (cost=16.90..26.42 rows=952 width=4)  
  Group Key: a1  
    -> Seq Scan on t1 (cost=0.00..14.52 rows=952 width=4)  
(3 rows)
```

```
postgres=> explain select distinct(id) from tt1;  
                QUERY PLAN
```

```
-----  
Unique (cost=0.42..33891.21 rows=1000102 width=4)  
  -> Index Only Scan using tt1_id_key on tt1 (cost=0.42..31390.96 rows=1000102 width=4)  
(2 rows)
```

```
postgres=> explain select distinct(name) from tt1;  
                QUERY PLAN
```

```
-----  
Unique (cost=132169.76..137170.27 rows=1000102 width=11)  
  -> Sort (cost=132169.76..134670.02 rows=1000102 width=11)  
        Sort Key: name  
        -> Seq Scan on tt1 (cost=0.00..15407.02 rows=1000102 width=11)
```

(4 rows)

hash cost: cheapest\_path + hashagg [+ final sort]  
sort cost: sorted\_path [+ sort] + group [final sort]

Hash VS Sort



## • 集合操作优化

```
postgres=> explain select a1 from t1 where a1 < 10 union select a2 from t2;
```

QUERY PLAN

---

HashAggregate (cost=36.28..46.38 rows=1010 width=4)

Group Key: t1.a1

-> Append (cost=0.28..33.75 rows=1010 width=4)

-> Index Only Scan using t1\_a1\_key on t1 (cost=0.28..8.65 rows=10 width=4)

Index Cond: (a1 < 10)

-> Seq Scan on t2 (cost=0.00..15.00 rows=1000 width=4)

```
postgres=> explain select a1 from t1 where a1 < 10 union all select a2 from t2;
```

QUERY PLAN

---

Append (cost=0.28..23.75 rows=1010 width=4)

-> Index Only Scan using t1\_a1\_key on t1 (cost=0.28..8.65 rows=10 width=4)

Index Cond: (a1 < 10)

-> Seq Scan on t2 (cost=0.00..15.00 rows=1000 width=4)

# 物理查询优化

- 主要优化方向
  - 单表扫描方式
  - 多表组合方式
  - 多表组合顺序

## 表扫描方式

- Seq scan, Index scan, Tid scan

```
postgres=> explain select * from t1 ;  
          QUERY PLAN
```

```
-----  
Seq Scan on t1 (cost=0.00..14.52 rows=952 width=8)
```

顺序扫描物理数据页

```
postgres=> explain select * from t1 where a1 = 10;  
          QUERY PLAN
```

```
-----  
Index Scan using t1_a1_key on t1 (cost=0.28..8.29 rows=1 width=8)  
Index Cond: (a1 = 10)
```

先通过索引值获得物理数据的位置，再到物理页读取

```
postgres=> explain select * from t1 where ctid='(1,10)';  
          QUERY PLAN
```

```
-----  
Tid Scan on t1 (cost=0.00..4.01 rows=1 width=8)  
TID Cond: (ctid = '(1,10)::tid)
```

通过page号和item号直接定位到物理数据

## • 选择度计算

### • 无条件

```
EXPLAIN SELECT * FROM tenk1;
```

#### QUERY PLAN

```
-----  
Seq Scan on tenk1 (cost=0.00..458.00 rows=10000 width=244)
```

```
SELECT relpages, reltuples FROM pg_class WHERE relname = 'tenk1';
```

```
relpages | reltuples  
-----+-----
```

```
358 | 10000
```

- 选择度计算
  - 大于或者小于

```
EXPLAIN SELECT * FROM tenk1 WHERE unique1 < 1000;
```

#### QUERY PLAN

---

```
Bitmap Heap Scan on tenk1 (cost=24.06..394.64 rows=1007 width=244)
```

```
Recheck Cond: (unique1 < 1000)
```

```
-> Bitmap Index Scan on tenk1_unique1 (cost=0.00..23.80 rows=1007 width=0)
```

```
Index Cond: (unique1 < 1000)
```

## • 计算公式

```
SELECT histogram_bounds FROM pg_stats  
WHERE tablename='tenk1' AND attname='unique1';
```

-----  
                  histogram\_bounds  
-----

{0, 993, 1997, 3050, 4040, 5036, 5957, 7057, 8029, 9016, 9995}

```
selectivity = (1 + (1000 - bucket[2].min) / (bucket[2].max - bucket[2].min)) / num_buckets  
            = (1 + (1000 - 993) / (1997 - 993)) / 10  
            = 0.100697
```

```
rows = rel_cardinality * selectivity  
      = 10000 * 0.100697  
      = 1007 (rounding off)
```

## • 选择度计算

### • 等于计算

```
EXPLAIN SELECT * FROM tenk1 WHERE stringu1 = 'CRAAAA';
```

#### QUERY PLAN

---

```
Seq Scan on tenk1 (cost=0.00..483.00 rows=30 width=244)
```

```
  Filter: (stringu1 = 'CRAAAA'::name)
```

## 计算公式

```
SELECT null_frac, n_distinct, most_common_vals, most_common_freqs FROM pg_stats  
WHERE tablename='tenk1' AND attname='stringu1';
```

```
null_frac          | 0  
n_distinct         | 676  
most_common_vals | {EJAAAA, BBAAAA, CRAAAA, FCAAAA, FEAAAA, GSAAAA, JOAAAA, MCAAAA, NAAAAA, WGAAAA}  
most_common_freqs | {0.00333333, 0.003, 0.003, 0.003, 0.003, 0.003, 0.003, 0.003, 0.003, 0.003}
```

```
selectivity = mcf[3]  
            = 0.003
```

```
rows = 10000 * 0.003  
      = 30
```

备注：如果值不在most\_common\_vals里面，计算公式为：

```
selectivity = (1 - sum(mvf))/(num_distinct - num_mcv)
```

pg\_stats统计信息  
很重要!!!



## cost计算

- 代价模型: 总代价=CPU代价+IO代价+启动代价

```
postgres=> explain select * from t1 where a1 > 10;
```

```
QUERY PLAN
```

```
-----  
Seq Scan on t1 (cost=0.00..16.90 rows=942 width=8)  
  Filter: (a1 > 10)  
(2 rows)
```

其中:

```
postgres=> select relpages, reltuples from pg_class where relname = 't1';
```

```
relpages | reltuples
```

```
-----+-----  
5 | 952
```

```
(1 row)
```

```
cpu_operator_cost=0.0025
```

```
cpu_tuple_cost=0.01
```

```
seq_page_cost=1
```

```
random_page_cost=4
```

Cost=16.90怎么计算出来的?

## cost计算

总cost = cpu\_tuple\_cost \* 952 + seq\_page\_cost \* 5 + cpu\_operator\_cost \* 952  
= 16.90

其他扫描方式cost计算可以参考如下函数：

```
postgres=> select amcostestimate, amname from pg_am ;
```

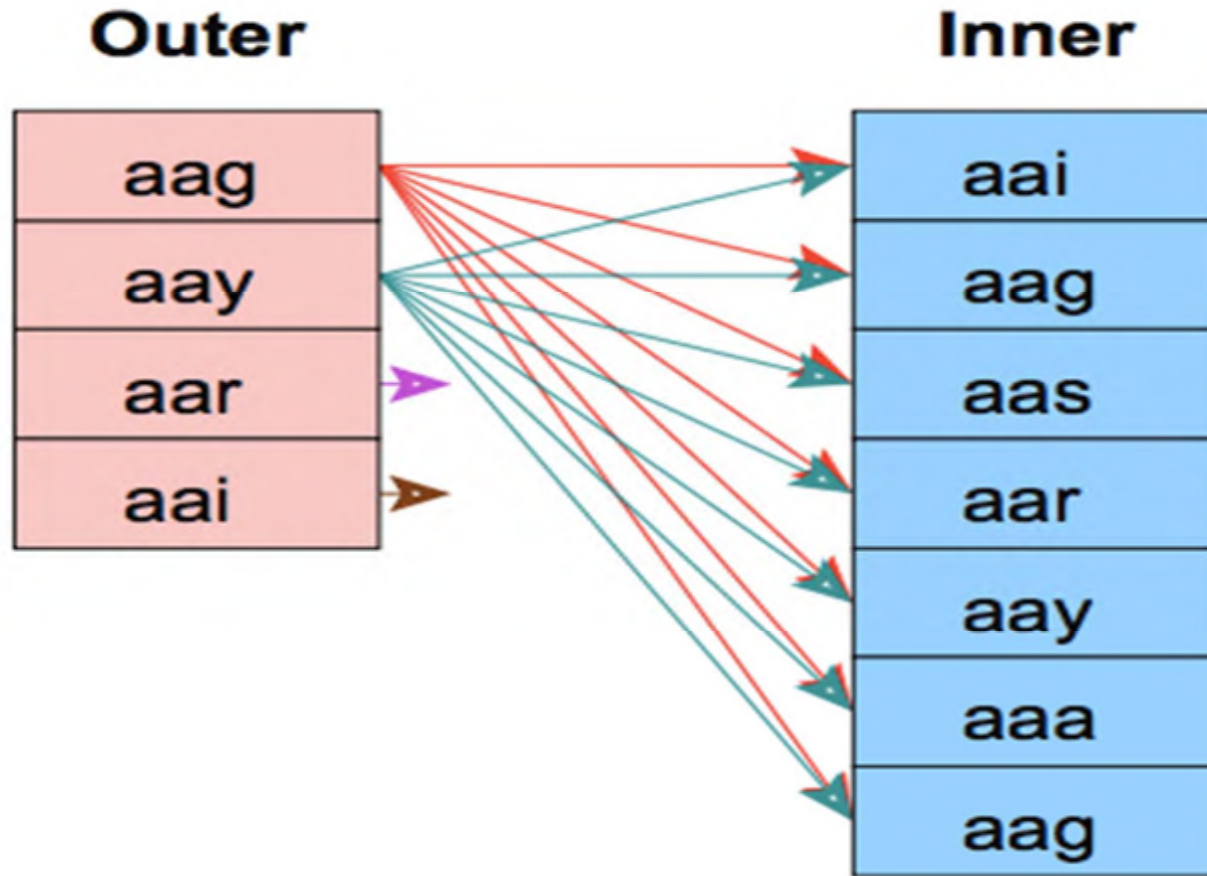
amcostestimate	amname
btcostestimate	btree
hashcostestimate	hash
gistcostestimate	gist
gincostestimate	gin
spgcostestimate	spgist

(5 rows)

# 表组合方式

- Nest Loop
- Hash Join
- Merge Join

# (Index) Nest Loop



# 简单连接代价估算

```
SELECT * FROM t1 L, t2 R WHERE L.id=R.id
```

假设:

$M = 20000$  pages in L,  $p_L = 40$  rows per page,

$N = 400$  pages in R,  $p_R = 20$  rows per page.

```
select relpages, reltuples from pg_class where relname= 't1'
```

# Nest Loop IO代价计算

L和R进行join

```
for l in L do
  for r in R do
    if rid == lid then ret += (r, s)
```

对于外表L每一个元组扫描内表R所有的元组

总IO代价:  $M + (p_L * M) * N = 20000 + (40 * 20000) * 400$   
 $= 320020000$

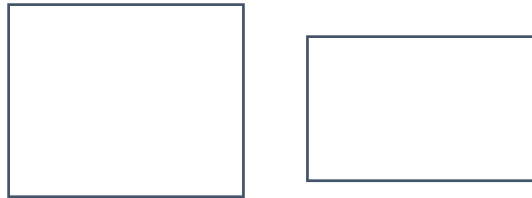
# Nest Loop Join

L表在磁盘上

2	...
12	...
6	...

1	...
5	...
27	...

Memory Buffers:



R表在磁盘上

...	2
...	13

...	12
...	27

...	1
...	5

# Nest Loop Join

L表在磁盘上

2	...
12	...
6	...

1	...
5	...
27	...



Memory Buffers:

2	...
12	...
6	...

...	2
...	13

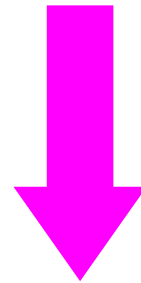


R表在磁盘上

...	2
...	13

...	12
...	27

...	1
...	5



结果

2 ... .. 2



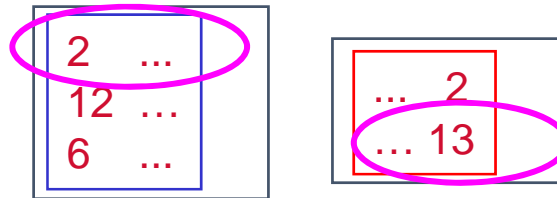
# Nest Loop Join

L表在磁盘上

2	...
12	...
6	...

1	...
5	...
27	...

Memory Buffers:



匹配失败!

R表在磁盘上

...	2
...	13

...	12
...	27

...	1
...	5

结果

2 ...      ... 2

# Nest Loop Join

L表在磁盘上

2	...
12	...
6	...

1	...
5	...
27	...

Memory Buffers:

2	...
12	...
6	...

...	12
...	27

R表在磁盘上

...	2
...	13

...	12
...	27

...	1
...	5

匹配失败!

结果

2 ...      ... 2

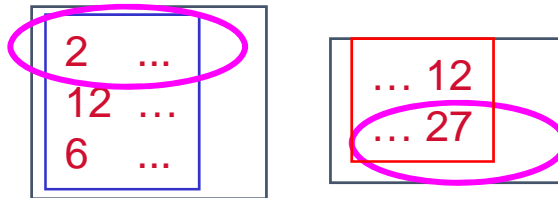
# Nest Loop Join

L表在磁盘上

2	...
12	...
6	...

1	...
5	...
27	...

Memory Buffers:



匹配失败!

R表在磁盘上

...	2
...	13

...	12
...	27

...	1
...	5

结果

2 ...      ... 2

# Nest Loop Join

L表在磁盘上

2	...
12	...
6	...

1	...
5	...
27	...

Memory Buffers:

2	...
12	...
6	...

...	1
...	5

匹配失败!

R表在磁盘上

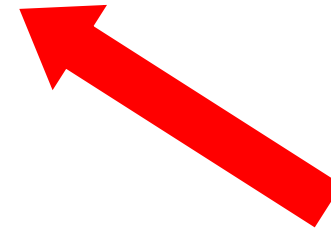
...	2
...	13

...	12
...	27

...	1
...	5



结果

2 ...      ... 2

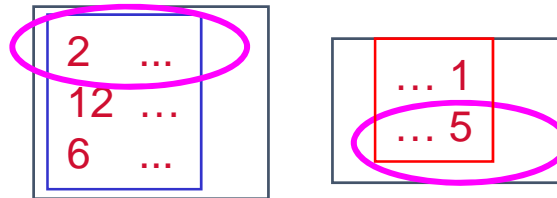
# Nest Loop Join

L表在磁盘上

2	...
12	...
6	...

1	...
5	...
27	...

Memory Buffers:



R表在磁盘上

...	2
...	13

...	12
...	27

...	1
...	5

匹配失败!

结果

2 ...      ... 2

# Nest Loop Join

L表在磁盘上

2	...
12	...
6	...

1	...
5	...
27	...

Memory Buffers:

2	...
12	...
6	...

...	2
...	13



R表在磁盘上

...	2
...	13

...	12
...	27

...	1
...	5

匹配失败!

结果

2 ...      ... 2

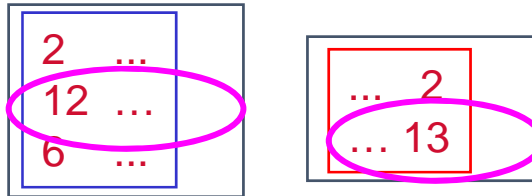
# Nest Loop Join

L表在磁盘上

2	...
12	...
6	...

1	...
5	...
27	...

Memory Buffers:



匹配失败!

R表在磁盘上

...	2
...	13

...	12
...	27

...	1
...	5

结果

2 ...      ... 2

# Nest Loop Join

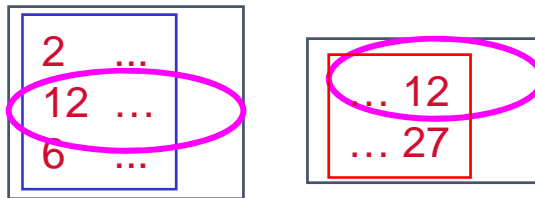
L表在磁盘上

2	...
12	...
6	...

1	...
5	...
27	...

Memory Buffers:



匹配成功!

R表在磁盘上

...	2
...	13

...	12
...	27

...	1
...	5

结果  
2 ... .. 2  
12 ... .. 12



# Index Nest Loop IO代价

```
SELECT * FROM t1 L, t2 R WHERE L.id=R.id
```

假设在表R.id上创建了索引

for l in L do

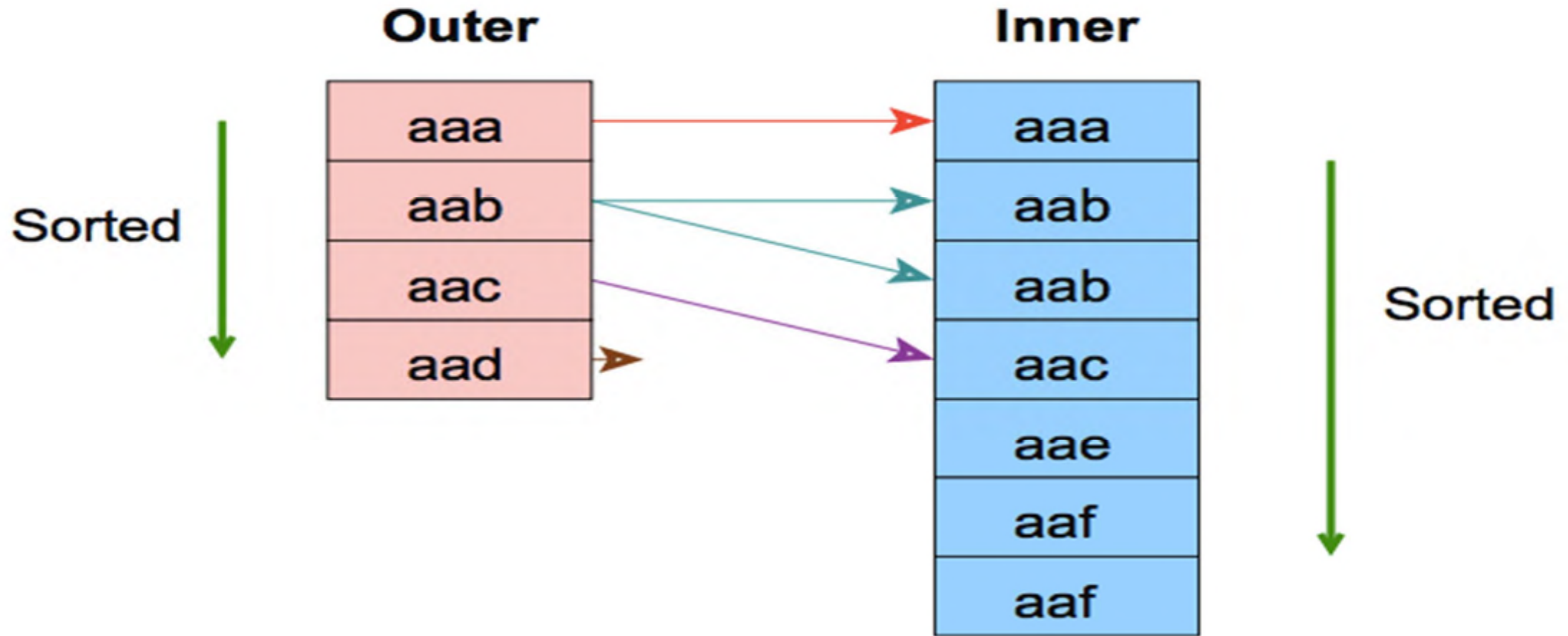
**Index Scan** r in R where l<sub>id</sub> = r<sub>id</sub>

ret += (l, r)

总IO:  $M + (M * p_L) * \text{cost of finding matching R rows}$

$= 20000 + (20000 * 40) * 3 = 2420000$

# Merge Join

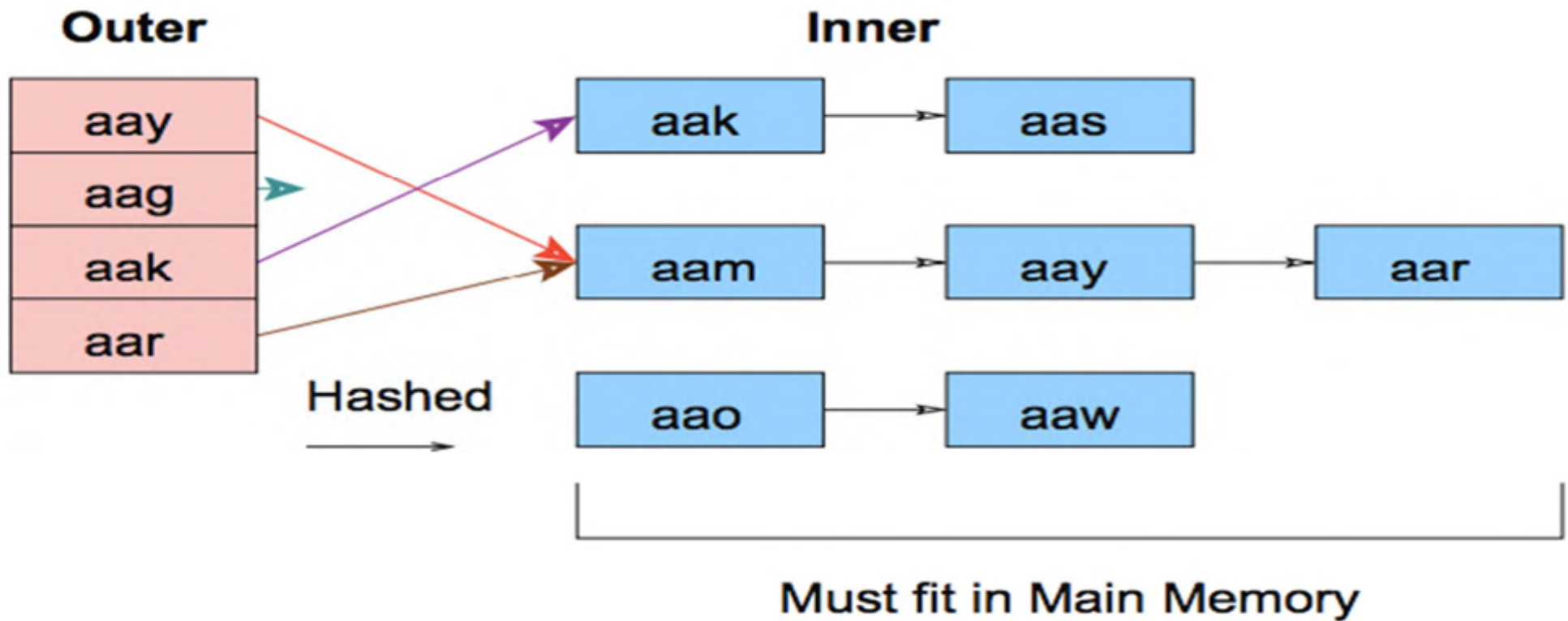


# Merge Join

主要分为3步:

1. Sort L on  $l_{id}$       代价  $M \log M$
2. Sort R on  $r_{id}$       代价  $N \log N$
3. Merge the sorted L and R on  $l_{id}$  and  $r_{id}$       代价  $M+N$

# Hash Join

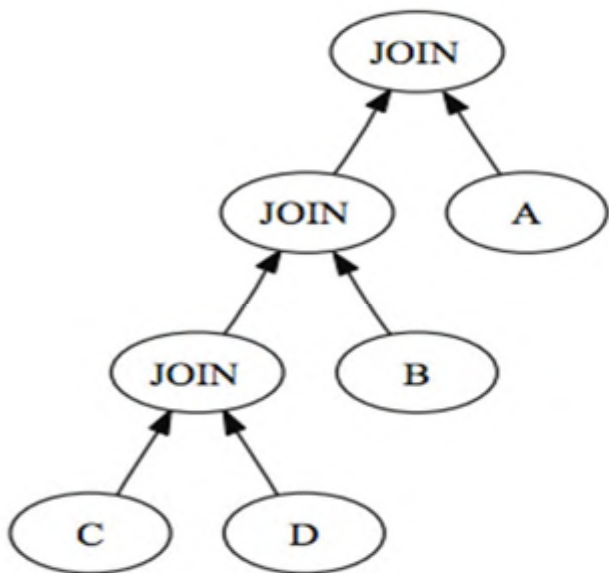


# 多表连接算法

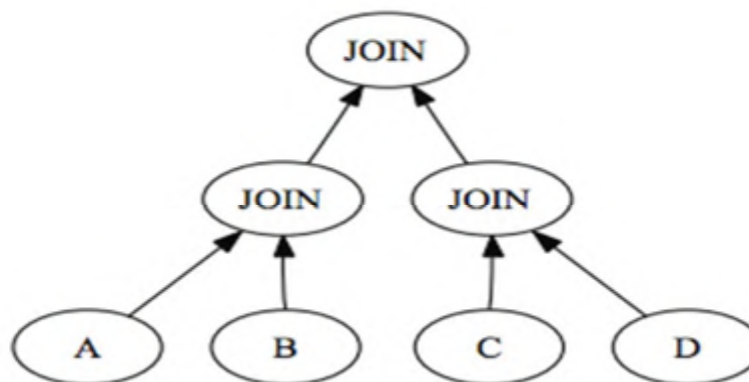
- 动态规划
- 遗传算法：适用于join特别多情况

# 多表连接算法

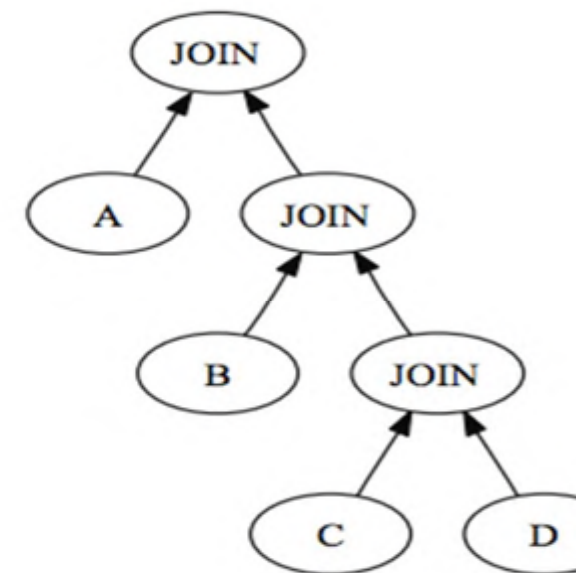
- 连接树



左深树

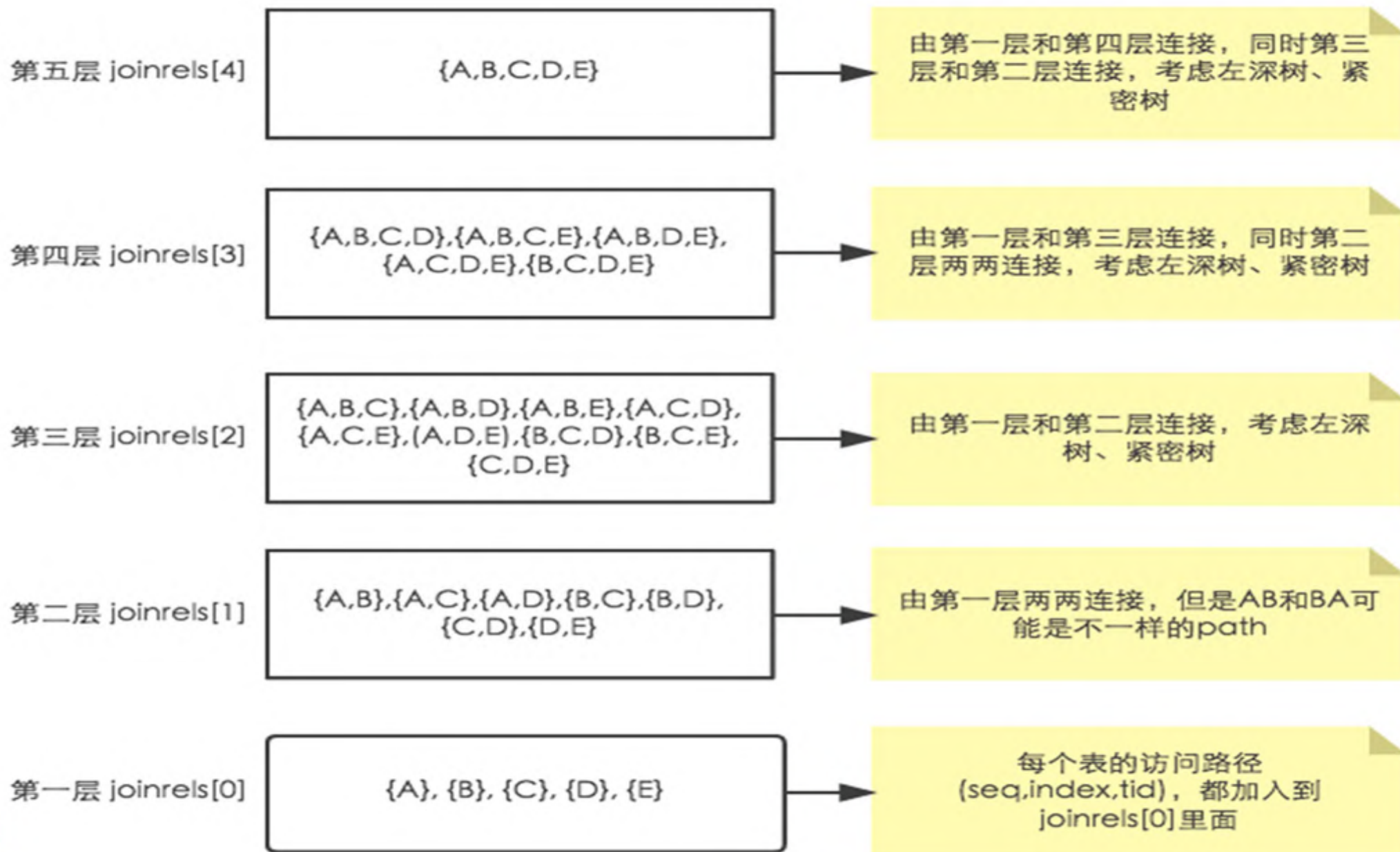


紧密型树



右深树

# 动态规划求解过程



# 动态规划

- 每个中间结果都保留三个路径
  - 1. 最小启动代价
  - 2. 代价最小路径
  - 3. 代价最小排序路径



# Thanks!

Q & A