# Query Processing for Non-traditional Applications 

CS848 Spring 2013

Cheriton School of CS

Query Plans

## Physical Design and Query Compilation: Overview



## Example Physical Design: Column Store

Logical Design: $\mathrm{S}_{\mathrm{L}}=\{$ employee $/ 3\}$

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\begin{aligned}
& \forall x, y_{1}, y_{2}, z_{1}, z_{2} \text {.employee }\left(x, y_{1}, z_{1}\right) \wedge \text { employee }\left(x, y_{2}, z_{2}\right) \\
& \rightarrow\left(y_{1}=y_{2} \wedge z_{1}=z_{2}\right)
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Physical Design: $S_{P}=S_{A}=\{$ emp-rid-eid/2/1, emp-eid-rid/2/0(/1)

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& \text { emp-rid-slry/2/1, emp-slry-rid/2/1 }\}
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\end{array}\right\}
$$

$\forall x, y, z . e m p l o y e e(x, y, z) \rightarrow$
$\exists$ a.emp-rid-eid $(a, x) \wedge$ emp-rid-name $(a, y) \wedge e m p-r i d-s l r y(a, z)$

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$\forall a, x_{1}, x_{2}$.emp-rid-eid $\left(a, x_{1}\right) \wedge$ emp-rid-eid $\left(a, x_{2}\right) \rightarrow x_{1}=x_{2}$
$\forall a, x$.emp-rid-eid $(a, x) \rightarrow \exists y, z$.employee $(x, y, z)$
$\forall a, y_{1}, y_{2}$.emp-rid-name $\left(a, y_{1}\right) \wedge$ emp-rid-name $\left(a, y_{2}\right) \rightarrow y_{1}=y_{2}$
$\forall a, y$.emp-rid-name $(a, y) \rightarrow \exists x$.emp-rid-eid $(a, x) \quad$ (same for-slry)

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\end{array}\right\}
$$

```
\(\forall x, y, z\).employee \((x, y, z) \rightarrow\)
    \(\exists\) a.emp-rid-eid \((a, x) \wedge\) emp-rid-name \((a, y) \wedge\) emp-rid-slry \((a, z)\)
\(\forall a, x_{1}, x_{2}\).emp-rid-eid \(\left(a, x_{1}\right) \wedge\) emp-rid-eid \(\left(a, x_{2}\right) \rightarrow x_{1}=x_{2}\)
\(\forall a, x . e m p-r i d-e i d(a, x) \rightarrow \exists y, z . e m p l o y e e(x, y, z)\)
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\(\forall a, y\).emp-rid-name \((a, y) \rightarrow \exists x\).emp-rid-eid \((a, x) \quad\) (same for-slry)
\(\forall a, x\).emp-rid-eid \((a, x) \leftrightarrow\) emp-eid-rid \((x, a)\) (same for -name, -slry)
```


## Queries over Column Store Physical Design

(1) employee $(x, y, z)$

$$
\exists \text { a.emp-eid-rid }(x, a) \wedge e m p-r i d-n a m e(a, y) \wedge e m p-r i d-s l r y(a, z)
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(9) $\exists x$.employee $(x, y, z)\{y\}$

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\{\exists a . e m p-\text { name-rid }(y, a) \wedge \text { emp-rid-slry }(a, z)\}
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## Issues to resolve (today)

- Why are the above plans implement the user queries?
- What "formulas" do qualify as plans?
$\Rightarrow$ how do we interpret logical connectives as programs?
- Are all (desired) plans captured by appropriate formulas?


## Physical Design and Query Compilation: Plans



## Physical Design and Query Compilation: Plans



We consider the structure of $Q^{\prime}$ :

- what formulas can be interpreted as plans
$\Rightarrow$ how do we deal with SETS in programs?
- what additional non-logical operations can be used.


## Outline

(1) Iterator Protocols to communicate Sets (review)
(2) Atomic Plan Operations: Access Paths (review)
(3) Logical Connectives/Quantifiers as Plan Operators
(9) Beyond Logical Operators: Dealing with Duplicates

## ACME Case: Access Path Code Templates

Pseudo-code templates realizing a first/next protocol for emp-array 0 might be given as follows (variables would be renamed for each occurrence of emp-array0 in a query plan).

```
function emp-array0-first
    i := 0
    return emp-array0-next
```

```
function emp-array0-next
    i := i + 1
    if (i > n) return false
    \mp@subsup{x}{1}{}}:= emp-array[i].emp-salary
    \mp@subsup{x}{2}{}}:== emp-array[i].emp-num
    x3 := emp-array[i].emp-name
    return true
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Assumes a global state recording bindings of (possible copies of) variables.
(1) $x_{1}, x_{2}$ and $x_{3}$ to communicate the contents of emp-array.
(2) $i$ and $n$ to record scanning status and size of emp-array.

Note: Code templates for access paths must be provided by ACME's DBA department.

## Iterator Execution

Hereon, assume $\mathbf{C}$ denotes the following code that prints a line for each result computed by a query plan $Q$, where $(\operatorname{In}(Q) \cup \operatorname{Out}(Q))=\left\{x_{1}, \ldots, x_{m}\right\}$.

```
if Q-first
    repeat
    printline(" }\mp@subsup{x}{1}{\prime" = \mp@subsup{x}{1}{},\ldots, " " }\mp@subsup{x}{m}{\prime\prime}=\mp@subsup{x}{m}{\prime}
    until not }Q\mathrm{ -next
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\operatorname{emp}-\operatorname{array} 0\left(x_{3}, x_{1}, x_{2}\right)
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Running $\mathbf{C}$ for a database (given by interpretation) $\mathcal{I}$ produces the following output.

$$
\begin{aligned}
& x_{1}=e_{1,1}, \quad x_{2}=e_{1,2}, \quad x_{3}=e_{1,3} \\
& x_{1}=e_{2,1}, \quad x_{2}=e_{2,2}, \quad x_{3}=e_{2,3} \\
& \vdots \\
& x_{1}=e_{n, 1}, \quad x_{2}=e_{n, 2}, \quad x_{3}=e_{n, 3}
\end{aligned}
$$

## Access Paths

The access paths $\mathrm{S}_{\mathrm{A}} \subseteq \mathrm{S}_{\mathrm{P}}$ are predicate symbols associated with a physical capability realized by an iterator implementation.
$\Rightarrow$ some attributes can be designated as parameters
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Requirements (for access path AP $/ k+I / I$ :

- given a fixed values for parameters there are only finitely many answers (bindings) to the remaining variables, i.e., the set

$$
\begin{aligned}
& \quad\left\{a_{1}, \ldots, a_{k} \mid \mathcal{I}, \mathcal{V} \models \exists x_{1}, \ldots, x_{l} \cdot \operatorname{AP}\left(x_{1}, \ldots, x_{l}, y_{1}, \ldots, y_{k}\right) \wedge\left(\bigwedge x_{i}=p_{i}\right)\right\} \\
& \text { (where } \left.\mathcal{V}=\left[y_{1}=a_{1}, \ldots, y_{k}=a_{k}\right]\right) \text { is finite. }
\end{aligned}
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- the invocation of the iterator protocol outputs all and only the valuations $\mathcal{V}$ that satisfy the condition above.


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\end{aligned}
$$

A plan interpretation $\mathcal{I}$ satisfies the above for every access path in $\mathrm{S}_{\mathrm{A}}$.

## (More Esoteric) Access Paths

(0) Built-in "operations":

- arithmetic (plus/3/2, times/3/2, etc.)
- string manipulation (concat/3/2, substr/4/3, etc.)
- ...
(2) data type tests (is-integer/1/1)
(3) pointer dereference and field extraction from records
(4) (page) reads from external storage
(c) ...


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$[Q]_{i}$ (duplicate elimination) (cut introduction)

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(2) If $Q=$ " $\exists x \cdot Q_{1}$ " then $x \notin \ln \left(Q_{1}\right)$.

## Parameters and User Query Embeddings

Input variables, output variables and user query mapping are as follows, where $\operatorname{Param}(\operatorname{Uq}(Q))=\ln (Q)$ always holds.

$$
\begin{aligned}
& \ln (Q)= \begin{cases}\ln \left(Q_{1}\right) \cup\left(\ln \left(Q_{2}\right)-\operatorname{Out}\left(Q_{1}\right)\right) & \text { if } Q="\left(Q_{1} \wedge Q_{2}\right) ", \\
\ln \left(Q_{1}\right) & \text { if } \left.Q=" \exists x \cdot Q_{1} ", \text { " }\left\{Q_{1}\right\} ", \text { or " }\left[Q_{1}\right]\right]_{i} \text { ", and }\end{cases} \\
& \text { if } Q="!{ }_{i} \text { ". } \\
& \operatorname{Out}(Q)= \begin{cases}\operatorname{Out}\left(Q_{1}\right) \cup \operatorname{Out}\left(Q_{2}\right) & \text { if } Q="\left(Q_{1} \wedge Q_{2}\right) ", \\
\operatorname{Out}\left(Q_{1}\right) \backslash\{x\} & \text { if } Q=" \exists x \cdot Q_{1} ", \\
\operatorname{Out}\left(Q_{1}\right) & \text { if } Q="\left\{Q_{1}\right\} " \text { or " }\left[Q_{1}\right] i \text { ", and } \\
\emptyset & \text { if } Q="!\text { ! ". }\end{cases} \\
& \operatorname{Uq}(Q)= \begin{cases}\left(\operatorname{Uq}\left(Q_{1}\right) \wedge \operatorname{Uq}\left(Q_{2}\right)\right) & \text { if } Q="\left(Q_{1} \wedge Q_{2}\right) ", \\
\exists x \cdot \operatorname{Uq}\left(Q_{1}\right) & \text { if } Q=" \exists x \cdot Q_{1} ", \\
\operatorname{Uq}\left(Q_{1}\right) & \text { if } Q="\left\{Q_{1}\right\} " \text { or " }\left[Q_{1}\right]_{i} ", \text { and } \\
\text { true } & \text { if } Q="!_{i} " .\end{cases}
\end{aligned}
$$

## Conjunctive Query Plans: Semantics

```
function ( }\mp@subsup{Q}{1}{}\wedge\mp@subsup{Q}{2}{})\mathrm{ -first
    if not }\mp@subsup{Q}{1}{}\mathrm{ -first return false
    while not }\mp@subsup{Q}{2}{}\mathrm{ -first do
        if not }\mp@subsup{Q}{1}{}\mathrm{ -next return false
    return true
```

```
function ( }\mp@subsup{Q}{1}{}\wedge\mp@subsup{Q}{2}{})\mathrm{ -next
    if }\mp@subsup{Q}{2}{}\mathrm{ -next return true
    while }\mp@subsup{Q}{1}{}\mathrm{ -next do
        if }\mp@subsup{Q}{2}{}\mathrm{ -first return true
    return false
```

```
function (\existsx.\mp@subsup{Q}{1}{})-first
    return }\mp@subsup{Q}{1}{}\mathrm{ -first
```

```
function ( }\existsx.\mp@subsup{Q}{1}{})\mathrm{ -next
    return }\mp@subsup{Q}{1}{}\mathrm{ -next
```

function $\left\{Q_{1}\right\}$-first
if not exists store $S$ create $S$
if $Q_{1}$-first empty $S$
add $\left\langle x_{1}, \ldots, x_{n}\right\rangle$ to $S$ return true
return false
function $\left\{Q_{1}\right\}$-next
while $Q_{1}$-next do if $\operatorname{not}\left\langle x_{1}, \ldots, x_{n}\right\rangle \in S$ add $\left\langle x_{1}, \ldots, x_{n}\right\rangle$ to $S$ return true
return false

## Conjunctive Query Plans: Semantics

```
function ([Q (Q ] i)-first function ([Q (Q ] ] )-next
    cuti := false
    return }\mp@subsup{Q}{1}{}\mathrm{ -first
```

```
function (!}\mp@subsup{i}{i}{\prime}\mathrm{ -first
    cuti := true
    return true
```


## Comparing and Assigning

Hereon, we assume a given physical signature includes two additional access paths.

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\{\text { compare } / 2 / 2 \text {,assign } / 2 / 1\} \subseteq \mathrm{S}_{\mathrm{A}}
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Semantics of compare $\left(x_{1}, x_{2}\right)$ and assign $\left(x_{1}, x_{2}\right)$ is given as follows.

```
function compare-first function compare-next
    if }\mp@subsup{x}{1}{}=\mp@subsup{x}{2}{}\mathrm{ return true return false
    return false
```

```
function assign-first
    X2 := }\mp@subsup{x}{1}{
    function assign-next
    return false
```

    return true
    
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function compare-first function compare-next
    if }\mp@subsup{x}{1}{}=\mp@subsup{x}{2}{}\mathrm{ return true return false
    return false
```

function assign-first
function assign-next
$x_{2}:=x_{1}$
return false
return true

Also assume any theory $\Sigma$ includes the following.

$$
\forall x_{1}, x_{2} . \operatorname{compare}\left(x_{1}, x_{2}\right) \equiv \operatorname{assign}\left(x_{1}, x_{2}\right) \equiv\left(x_{1} \approx x_{2}\right)
$$

## ACME Case: Scanning and Selection

Consider where the APS department needs a plan that will report the employee-number $x$ and name $y$ of each employee that has a given salaryz.

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\exists u \cdot(\operatorname{emp}-\operatorname{array} 0(u, x, y) \wedge \operatorname{compare}(z, u))
$$

Input and output variables: $\{z\}$ and $\{x, y\}$, respectively.

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(3) If this comparison evaluates to true then add the contents of this element to the result.

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Consider where the APS department needs a plan that will report the employee-number $x$ and name $y$ of each employee that has a given salary $z$. A query plan using access path emp-array 0 can now be formulated.

$$
\exists u \cdot(\operatorname{emp}-\operatorname{array} 0(u, x, y) \wedge \operatorname{compare}(z, u))
$$

Input and output variables: $\{z\}$ and $\{x, y\}$, respectively.
Execution proceeds as follows.
(1) Use access path emp-array0 to scan emp-array (an atomic query subplan).
(2) For each element of emp-array returned by this scan, compare the salary field with the supplied parameter value $z$ (by using an operator for nested cross product coupled with another atomic query subplan using access path compare).
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Note: (a) Duplicate preserving projection has no effect on execution, and (b) duplicate elimination is not required since employees must have unique employee numbers.

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Consider where the APS department needs a plan that will report the name $y$ of any employee that has a given salary $z$ and employee-number x. A query plan $Q$ using access path emp-array0 can also be formulated.

$$
\exists u, v .(\operatorname{emp}-\operatorname{array} 0(u, v, y) \wedge \operatorname{compare}(x, v) \wedge \operatorname{compare}(z, u))
$$

Input and output variables: $\{y\}$ and $\{x, z\}$, respectively.

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$$

Input and output variables: $\{y\}$ and $\{x, z\}$, respectively. Pseudo-code templates realizing a first/next protocol for $Q$ is then defined as follows.

```
function Q-first
    i := 0
    while i < n do
        i := i + 1
        u := emp-array[i].emp-salary
        v := emp-array[i].emp-num
        y := emp-array[i].emp-name
        if }x=
            if }z=u\mathrm{ return true
    return false
```

```
function Q-next
    while i < n do
        i := i + 1
        u := emp-array[i].emp-salary
        v := emp-array[i].emp-num
        y := emp-array[i].emp-name
        if }x=
        if }Z=u\mathrm{ return true
    return false
```


## ACME Case: Scanning and Cutting

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Recall that employees have unique employee numbers. Can therefore add cut introduction and named cut operators to $Q$ to improve performance.

$$
\exists u, v .\left([\operatorname{emp}-\operatorname{array} 0(u, v, y) \wedge \operatorname{compare}(x, v)]_{1} \wedge!_{1} \wedge \operatorname{compare}(z, u)\right)
$$

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$$

Pseudo-code templates realizing a first/next protocol for $Q$ are then modified as follows.

```
function Q-first
    i := 0
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        u := emp-array[i].emp-salary
        v := emp-array[i].emp-num
        y := emp-array[i].emp-name
        if }x=
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        return false
    return false
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A query plan using access path emp-array 0 implementing this query is as follows.

$$
\{\exists x, y . \text { emp-array } 0(z, x, y)\}
$$

The plan uses a top-level duplicate elimination operation that will use temporary store to accumulate new salary values as they occur in a scan of emp-array with access path emp-array 0.

## General Query Plans: Syntax

The query plans induced by S add two final productions:
$Q \quad:=\left(Q_{1} \vee Q_{2}\right)$ (concatenation)

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Also require any query plan to satisfy two additional conditions.
(1) If $Q=$ " $\left(Q_{1} \vee Q_{2}\right)$ " then $\operatorname{Out}\left(Q_{1}\right)=\operatorname{Out}\left(Q_{2}\right)$.

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(2) If $Q=" \neg Q_{1}$ " then $\operatorname{Out}\left(Q_{1}\right)=\emptyset$.

## Parameters and User Query Embeddings

Input variables, output variables and user query mapping are extended as follows, where $\operatorname{Param}(\operatorname{Uq}(Q))=\ln (Q)$ always holds.

$$
\begin{aligned}
& \operatorname{In}(Q)= \begin{cases}\ln \left(Q_{1}\right) \cup \ln \left(Q_{2}\right) & \text { if } Q="\left(Q_{1} \vee Q_{2}\right) ", \text { and } \\
\ln \left(Q_{1}\right) & \text { if } Q=" \neg Q_{1} " .\end{cases} \\
& \operatorname{Out}(Q)= \begin{cases}\operatorname{Out}\left(Q_{1}\right) \cap \operatorname{Out}\left(Q_{2}\right) & \text { if } Q="\left(Q_{1} \vee Q_{2}\right) ", \text { and } \\
\emptyset & \text { if } Q=" \neg Q_{1} " .\end{cases} \\
& \operatorname{Uq}(Q)= \begin{cases}\left(\operatorname{Uq}\left(Q_{1}\right) \vee \operatorname{Uq}\left(Q_{2}\right)\right) & \text { if } Q="\left(Q_{1} \vee Q_{2}\right) ", \text { and } \\
\neg \operatorname{Uq}\left(Q_{1}\right) & \text { if } Q=" \neg Q_{1} " .\end{cases}
\end{aligned}
$$

## General Query Plans: Semantics

$$
\begin{aligned}
& \text { function }\left(Q_{1} \vee Q_{2}\right) \text {-first } \\
& \left(Q_{1} \vee Q_{2}\right) \text {-flag : }=\text { true } \\
& \text { if } Q_{1}-\text { first return true } \\
& \left(Q_{1} \vee Q_{2}\right) \text {-flag }:=\text { false } \\
& \text { return } Q_{2} \text {-first }
\end{aligned}
$$

```
```

function ( }\neg\mp@subsup{Q}{1}{})\mathrm{ -first

```
```

function ( }\neg\mp@subsup{Q}{1}{})\mathrm{ -first
if }\mp@subsup{Q}{1}{}\mathrm{ -first return false
if }\mp@subsup{Q}{1}{}\mathrm{ -first return false
return true

```
```

    return true
    ```
```

```
function \(\left(Q_{1} \vee Q_{2}\right)\)-next
    if \(\left(Q_{1} \vee Q_{2}\right)\)-flag
        if \(Q_{1}\)-next return true
    \(\left(Q_{1} \vee Q_{2}\right)\)-flag \(:=\) false
    return \(Q_{2}\)-next
```

```
function (}\neg\mp@subsup{Q}{1}{})\mathrm{ -next
    return false
```


## ACME Case: Concatenation

Consider where the APS department needs a plan that will find the employee-number $x$ for any employee that has a salary matching either the parameter $p_{1}$ or the parameter $p_{2}$.

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A query plan using access path emp-array 0 implementing this query is as follows.

$$
\begin{aligned}
& \text { \{( } \\
& \left.\exists y, z \text {.(emp-array } 0(z, x, y) \wedge \operatorname{compare}\left(p_{1}, z\right)\right) \\
& \left.\vee \exists u, v .\left(\operatorname{emp}-\operatorname{array} 0(v, x, u) \wedge \operatorname{compare}\left(p_{2}, v\right)\right)\right) \\
& \text { \} }
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{(
    \existsy,z.(emp-array0(z,x,y)^ compare(p}(\mp@subsup{p}{1}{},z)
    \vee\existsu,v.(emp-array0(v,x,u)^ compare( }\mp@subsup{p}{2}{},v))
}
```

An execution proceeds as follows.
(1) Scan emp-array and add the employee number of any employee with a salary given by input parameter $p_{1}$ to a temporary store $S$ if not already there.

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A query plan using access path emp-array 0 implementing this query is as follows.

$$
\begin{aligned}
& \left\{\left(\begin{array}{l}
\quad \exists, z .\left(\text { emp-array } 0(z, x, y) \wedge \operatorname{compare}\left(p_{1}, z\right)\right) \\
\vee \\
\left.\vee \exists u, v .\left(\operatorname{emp}-\operatorname{array} 0(v, x, u) \wedge \operatorname{compare}\left(p_{2}, v\right)\right)\right)
\end{array}\right\}\right.
\end{aligned}
$$

An execution proceeds as follows.
(1) Scan emp-array and add the employee number of any employee with a salary given by input parameter $p_{1}$ to a temporary store $S$ if not already there.
(2) Scan emp-array for a second time and add the employee number of any employee with a salary given by input parameter $p_{2}$ to $S$ if not already there.

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Note: The user query mapping of the plan is a positive query (since it is a union of two conjunctive queries).

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An alternative plan can be formulated that avoids the need for two scans of emp-array.

$$
\left\{\exists y, z .\left(\operatorname{emp}-\operatorname{array} 0(z, x, y) \wedge\left(\operatorname{compare}\left(p_{1}, z\right) \vee \operatorname{compare}\left(p_{2}, z\right)\right)\right)\right\}
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The plan illustrates a common plan idiom for determining if a given value occurs in a given small fixed set of values.

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Two possible reasons for requiring top-level duplicate elimination.
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Two possible reasons for requiring top-level duplicate elimination.
(1) Individual employee numbers may be related to more than one salary or employee name.
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The first reason is ruled out by the logical design of payroll.
The second reason can be ruled out by modifying the plan to ensure the second subplan for the concatenation operator will only return additional results when $p_{1}$ and $p_{2}$ are distinct.

$$
\begin{aligned}
& \exists y, z .(\text { emp-array } 0(z, x, y) \\
& \left.\quad \wedge\left(\operatorname{compare}\left(p_{1}, z\right) \vee\left(\neg \operatorname{compare}\left(p_{1}, p_{2}\right) \wedge \operatorname{compare}\left(p_{2}, z\right)\right)\right)\right)
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\end{aligned}
$$

Note that the query mapping for this plan is no longer a positive query. An alternative plan avoids simple complement by using a cut.

$$
\left.\exists y, z .\left(\operatorname{emp}-\operatorname{array} 0(z, x, y) \wedge\left[\left(\operatorname{compare}\left(p_{1}, z\right) \vee \operatorname{compare}\left(p_{2}, z\right)\right)\right]_{1} \wedge!_{1}\right)\right)
$$

## ACME Case: Simple Complement

Consider where the APS department needs a plan that will find the employee-number $x$ for any employee that has a name that is also unique.

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Consider where the APS department needs a plan that will find the employee-number $x$ for any employee that has a name that is also unique.

Two plans using access path emp-array 0 and a simple complement operator are as follows.

$$
\begin{aligned}
\exists y, z . & (\text { emp-array } 0(z, x, y) \\
\wedge & \neg \exists u, v, w \cdot(\operatorname{emp}-\operatorname{array} 0(u, v, w) \\
& \wedge \operatorname{compare}(y, w) \\
& \wedge \neg \operatorname{compare}(x, v))) \\
\exists y, z . & (\text { emp-array } 0(z, x, y) \\
\wedge & \neg \exists u, v, w \cdot\left([\operatorname{emp}-\operatorname{array} 0(u, v, w)]_{1}\right. \\
& \wedge \operatorname{compare}(y, w) \\
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\wedge & \neg \exists u, v, w \cdot(\operatorname{emp}-\operatorname{array} 0(u, v, w) \\
& \wedge \operatorname{compare}(y, w) \\
& \wedge \neg \operatorname{compare}(x, v))) \\
\exists y, z . & (\text { emp-array } 0(z, x, y) \\
\wedge & \neg \exists u, v, w \cdot\left([\operatorname{emp}-\operatorname{array} 0(u, v, w)]_{1}\right. \\
& \wedge \operatorname{compare}(y, w) \\
& \wedge \neg \operatorname{compare}(x, v)) \\
& \left.\wedge!_{1}\right)
\end{aligned}
$$

Question: Which is more efficient?

## When do Plans Implement User Queries?

## Requirements

Given a plan interpretation $\mathcal{I}$, the plan $Q^{\prime}$ (driven by $\mathbf{C}$ ) outputs exactly the valuations that make the user query $Q$ true in $\mathcal{I}$.

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What can we do with this?

- we show how to model many (if not most) features of standard SQL implementations using the operators introduced today with the help of creative physical design and selection of access paths (next time).


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## What can we do with this?

- we show how to model many (if not most) features of standard SQL implementations using the operators introduced today with the help of creative physical design and selection of access paths (next time).

How do we actually find plans?
(1) we search for $Q^{\prime}$ that (as a formula) is logically equivalent to $Q$ under the logical and physical schama constraints $\Sigma$, and
(2) we improve $Q^{\prime}$ by eliminating duplicate elimination operations and by inserting cuts.

## Queries over Column Store Physical Design Revisited

(1) employee $(x, y, z)$

$$
\exists a \text {.emp-eid-rid }(x, a) \wedge \text { emp-rid-name }(a, y) \wedge \text { emp-rid-slry }(a, z)
$$

(2) $\exists y, z$.employee $(x, y, z)$

$$
\exists \text { a.emp-eid-rid }(x, a)
$$

(3) $\exists$ z.employee $(x, y, z)$

$$
\exists a . e m p-e i d-r i d(x, a) \wedge \text { emp-rid-name }(a, y)
$$

(9) $\exists x$.employee $(x, y, z)\{y\}$

$$
\{\exists a . e m p-n a m e-r i d(y, a) \wedge e m p-r i d-s l r y(a, z)\}
$$

## Results:

- Plans for queries 1-4 are logically equivalent to the given user queries.
- Plans 1-3 can avoid duplicate eimination operator.


## Related Issues

- Relational Algebra
- Domain Independence and Range restricted Queries
- Temporary storage
- Ordered properties of iterated semantics (merge joins?)
- Streaming queries

