

# Checkpont 3: Joins

April 20, 2017

# Recap: Joins

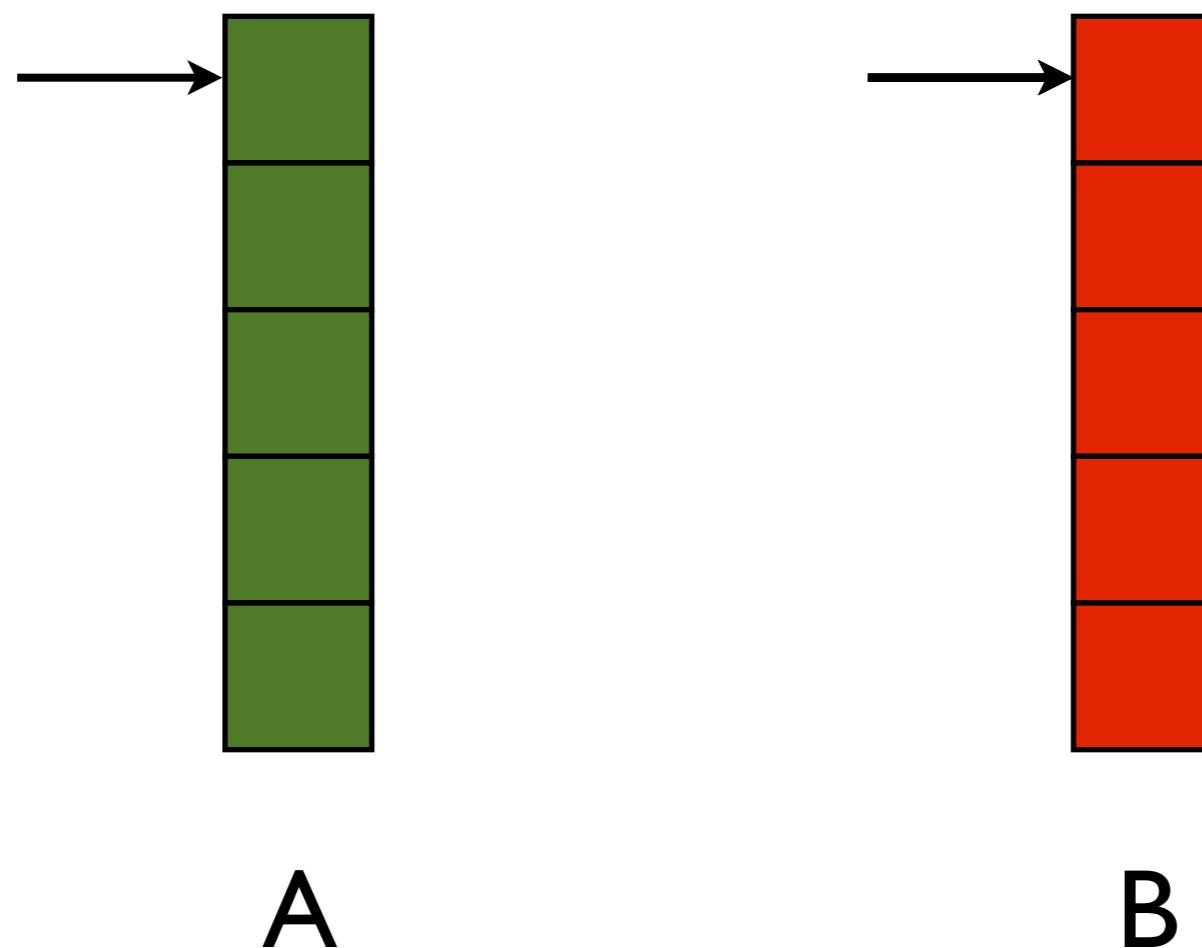
- Two General Classes of Joins
  - Equality (Equi-) Joins:  $R.B = S.B$
  - Inequality (Inequi-) Joins:  $R.B < S.B$

Inequi-joins are  $O(N^2)$  (as bad as NLJ)  
Checkpoint 3 focuses on Equi-joins

# Implementing: Joins

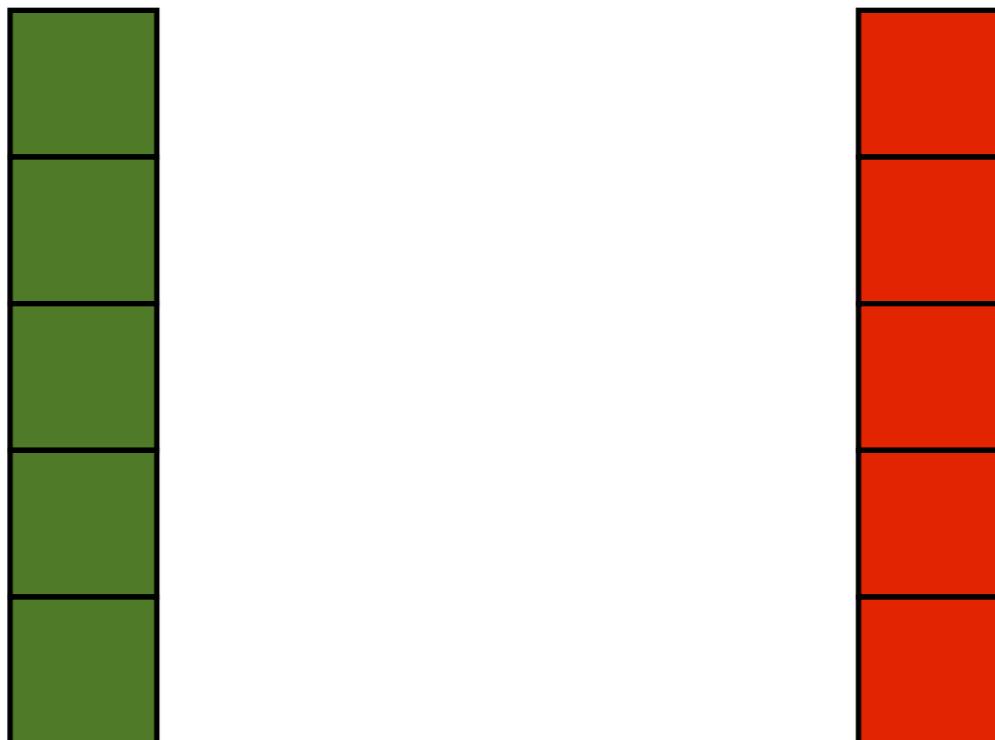
## Solution 0 (Nested-Loop)

For Each (a in A) { For Each (b in B) { emit (a, b); }}



# Implementing: Joins

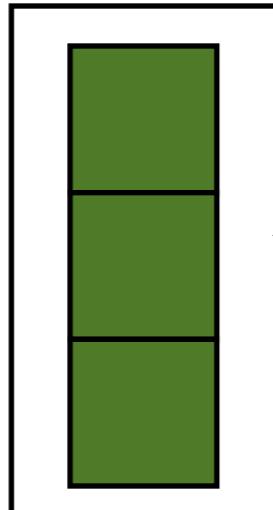
## **Solution I** (Block-Nested-Loop)



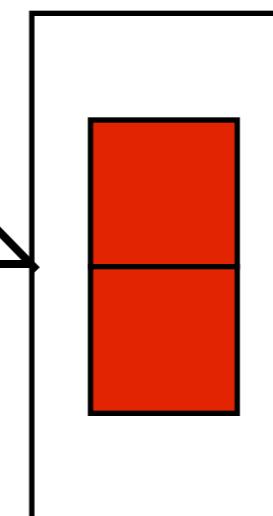
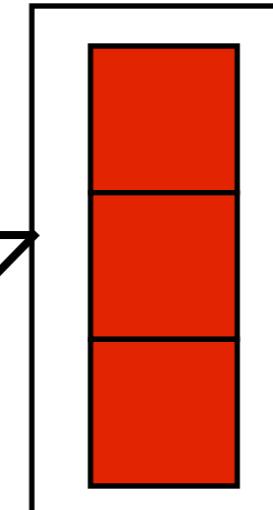
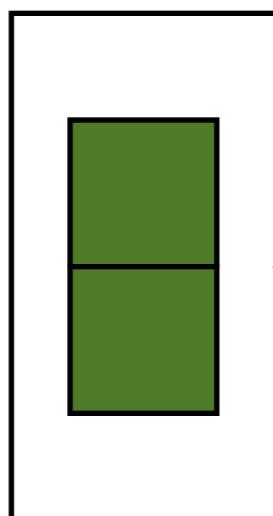
# Implementing: Joins

## **Solution I** (Block-Nested-Loop)

I) Partition into Blocks



2) NLJ on each pair of blocks

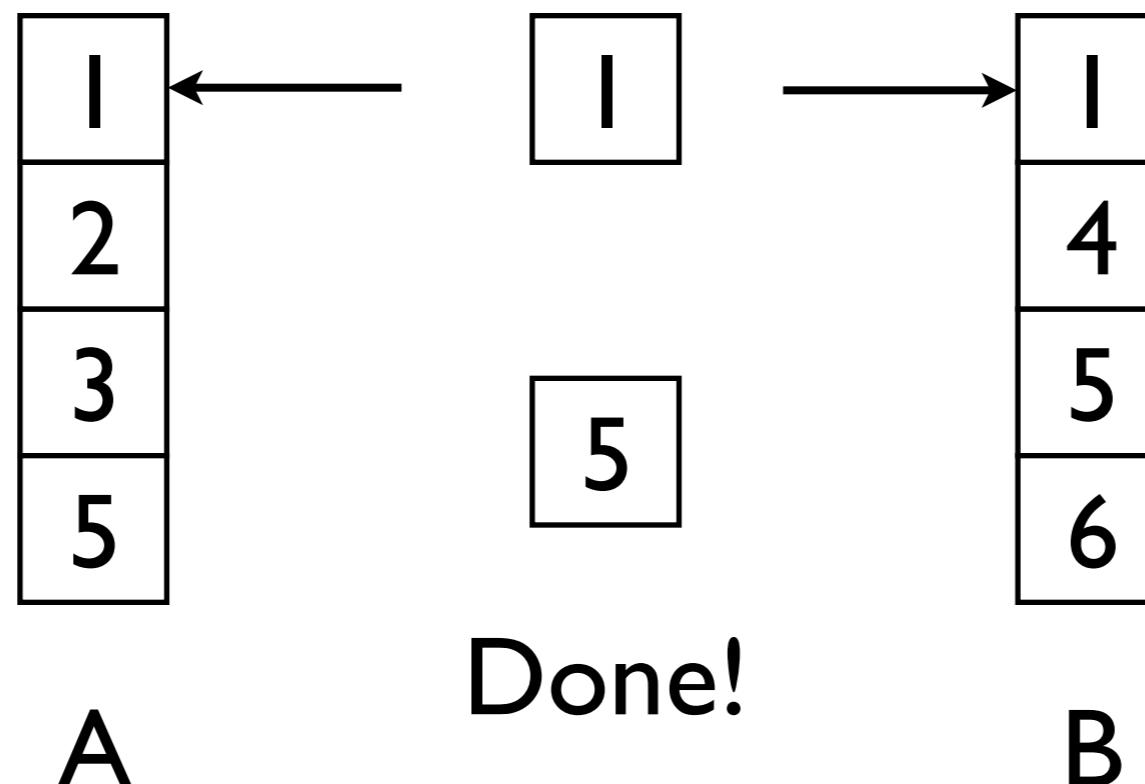


# Implementing: Joins

## Solution 2 (Sort-Merge Join)

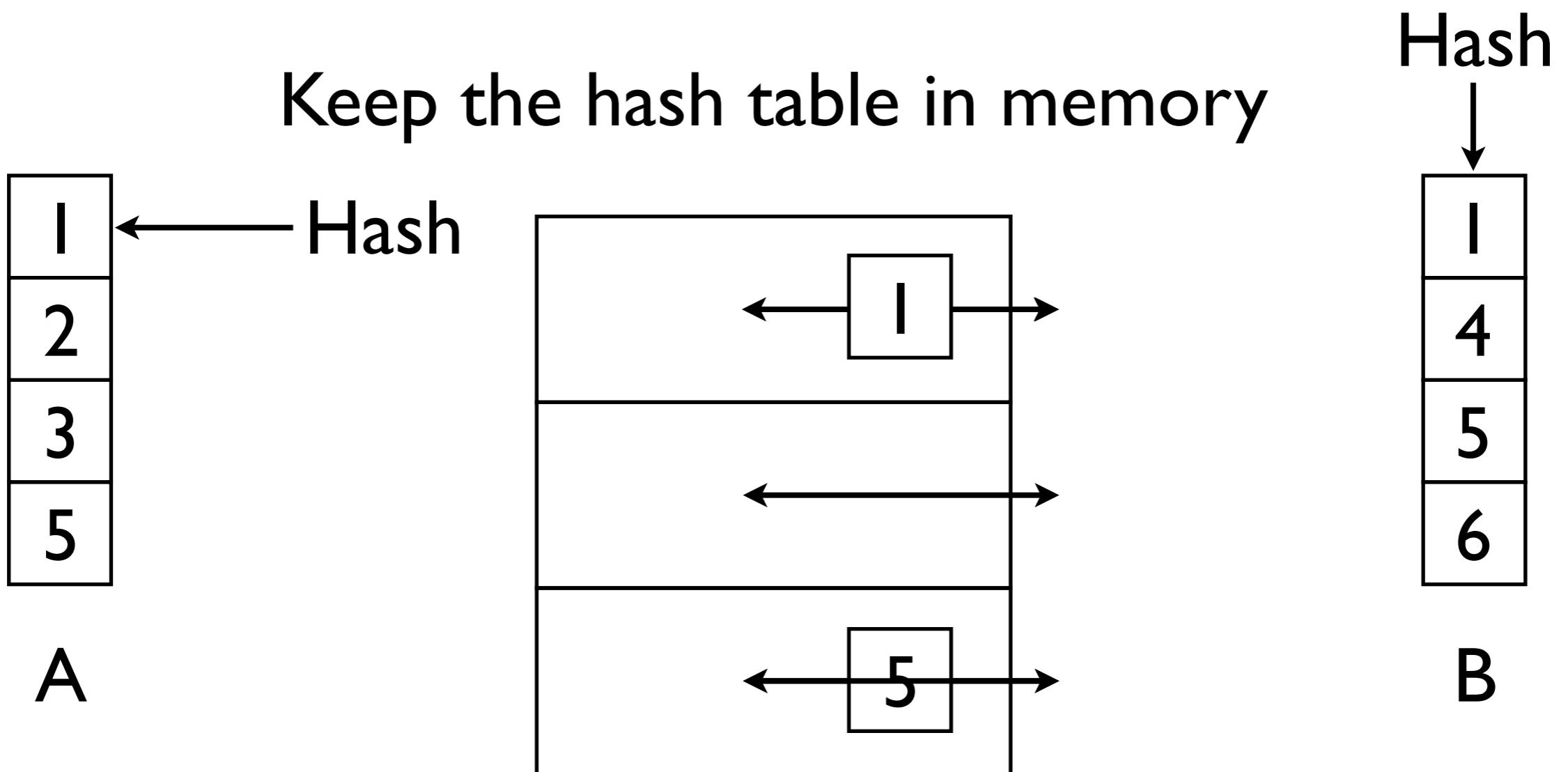
Keep iterating on the set with the lowest value.

When you hit two that match, emit, then iterate both



# Implementing: Joins

## Solution 3 (1-Pass Hash)

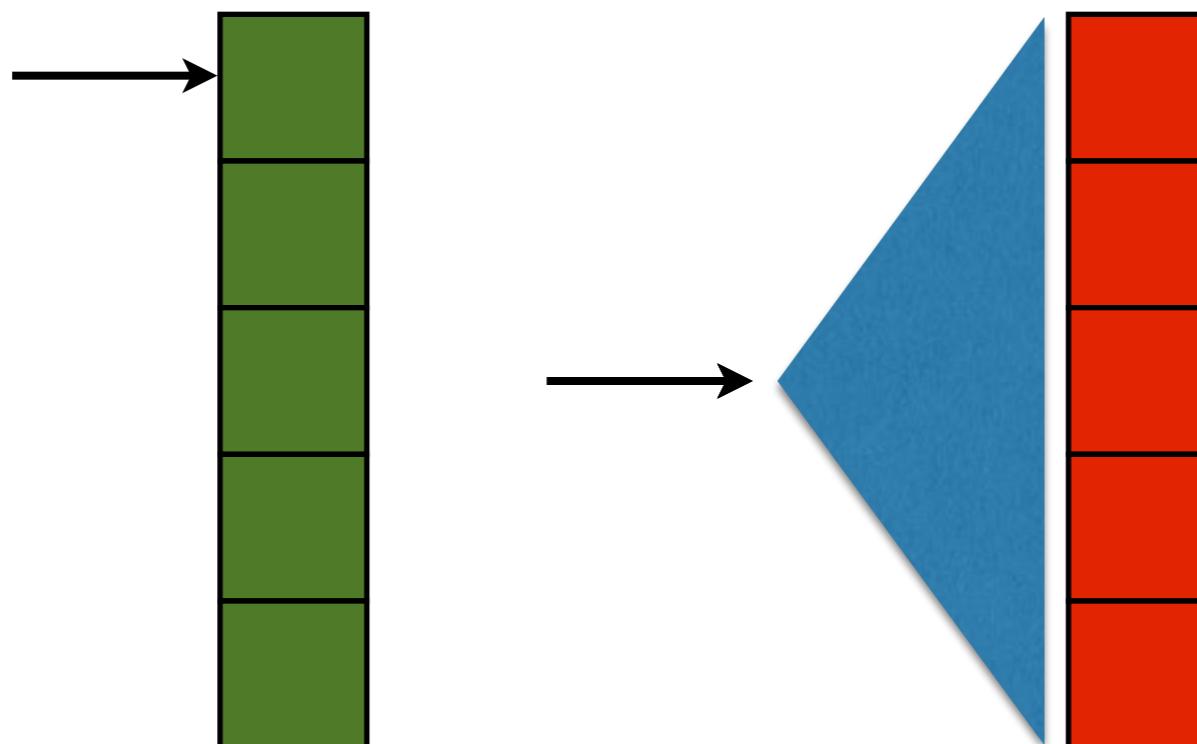


(Essentially a more efficient nested loop join)

# Implementing: Joins

## **Solution 4 (Index-Nested-Loop)**

Like nested-loop, but use an index to make  
the inner loop much faster!



What are the tradeoffs of each algorithm?

What properties  
do we care about?

How do the  
algorithms compare?

```
sif$ java -cp build/*.jar \
edu.cse.buffalo.cse562.Main \
--in-mem \
tpch_sch.sql tpch1.sql
```

**Phase 1:** Identical... just needs support for joins.

```
sif$ java -Xmx200m -cp build/*.jar \
edu.cse.buffalo.cse562.Main \
--on-disk \
tpch_sch.sql tpch1.sql
```

**Phase 2:** Identical... just needs support for joins.

```
CREATE TABLE R ( A int, B int );
```

```
CREATE TABLE S ( B int, C int );
```

```
SELECT R.A, S.C FROM R, S WHERE R.B = S.B;
```

body.getFromItem()

↓  
**query** = R

---

body.getJoins()

↓  
for(j : joins) { **query** = x(**query**, j.table) }

---

body.getWhere()

↓  
**query** =  $\sigma(\text{where}, \text{query})$

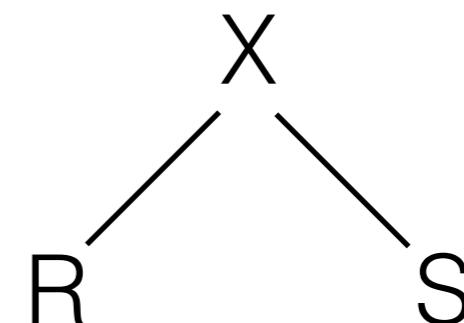
---

body.getSelectItems()

↓  
**query** =  $\pi(\text{items}, \text{query})$

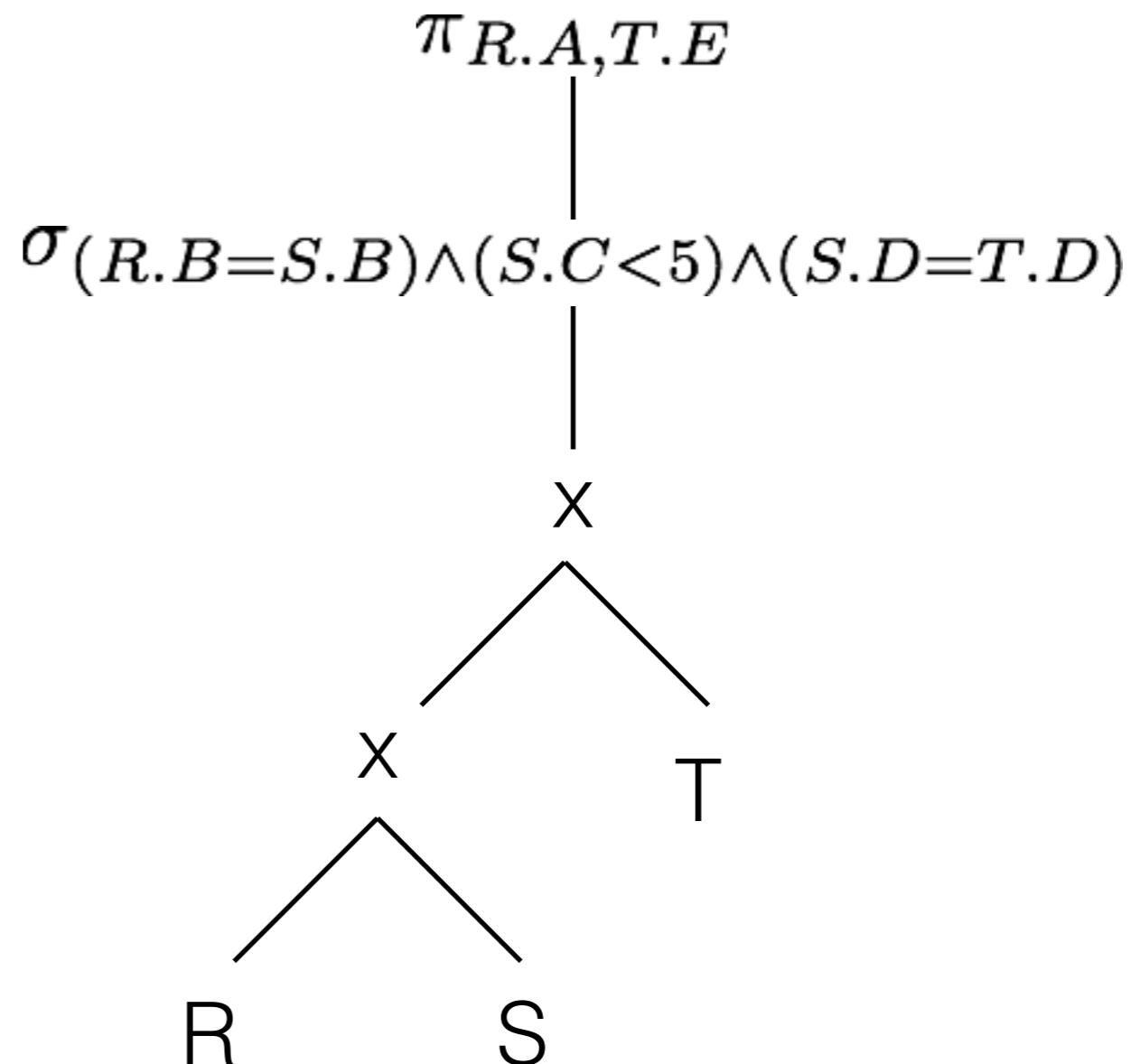
$\pi(A, C)$

$\sigma(R.B = S.B)$

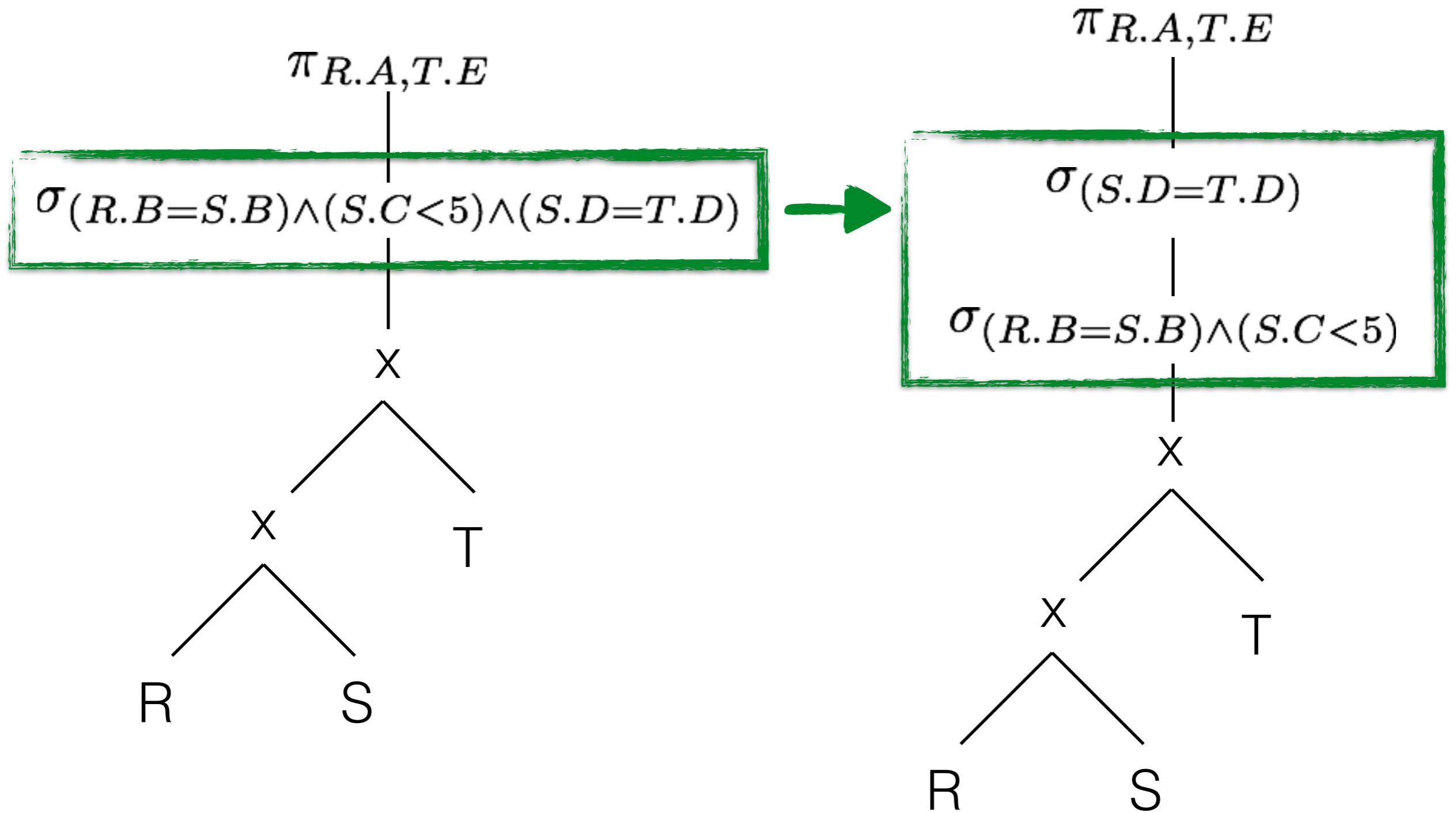


# Recap: Optimization

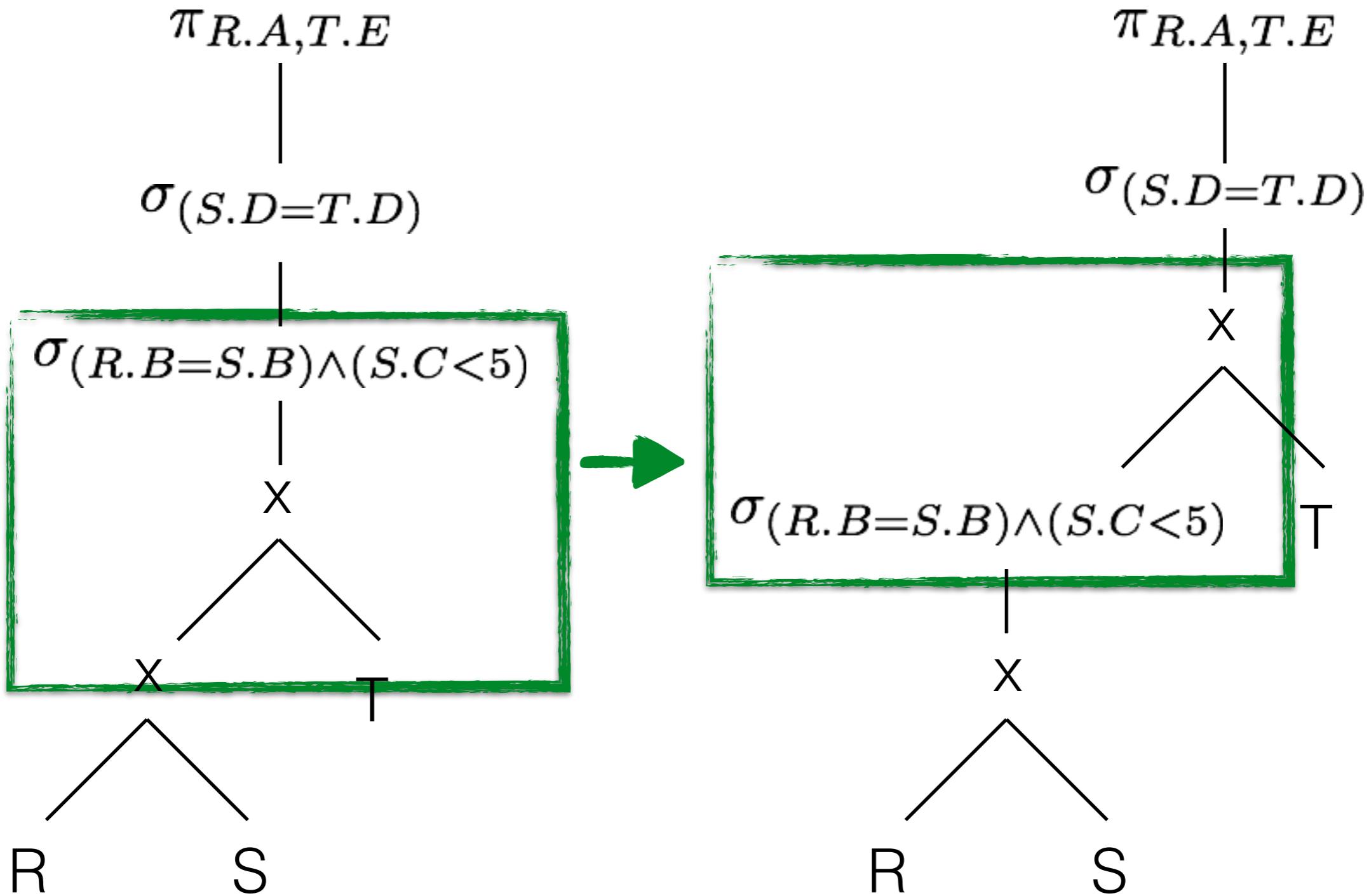
```
SELECT R.A, T.E  
FROM R, S, T  
WHERE R.B = S.B  
AND S.C < 5  
AND S.D = T.D
```



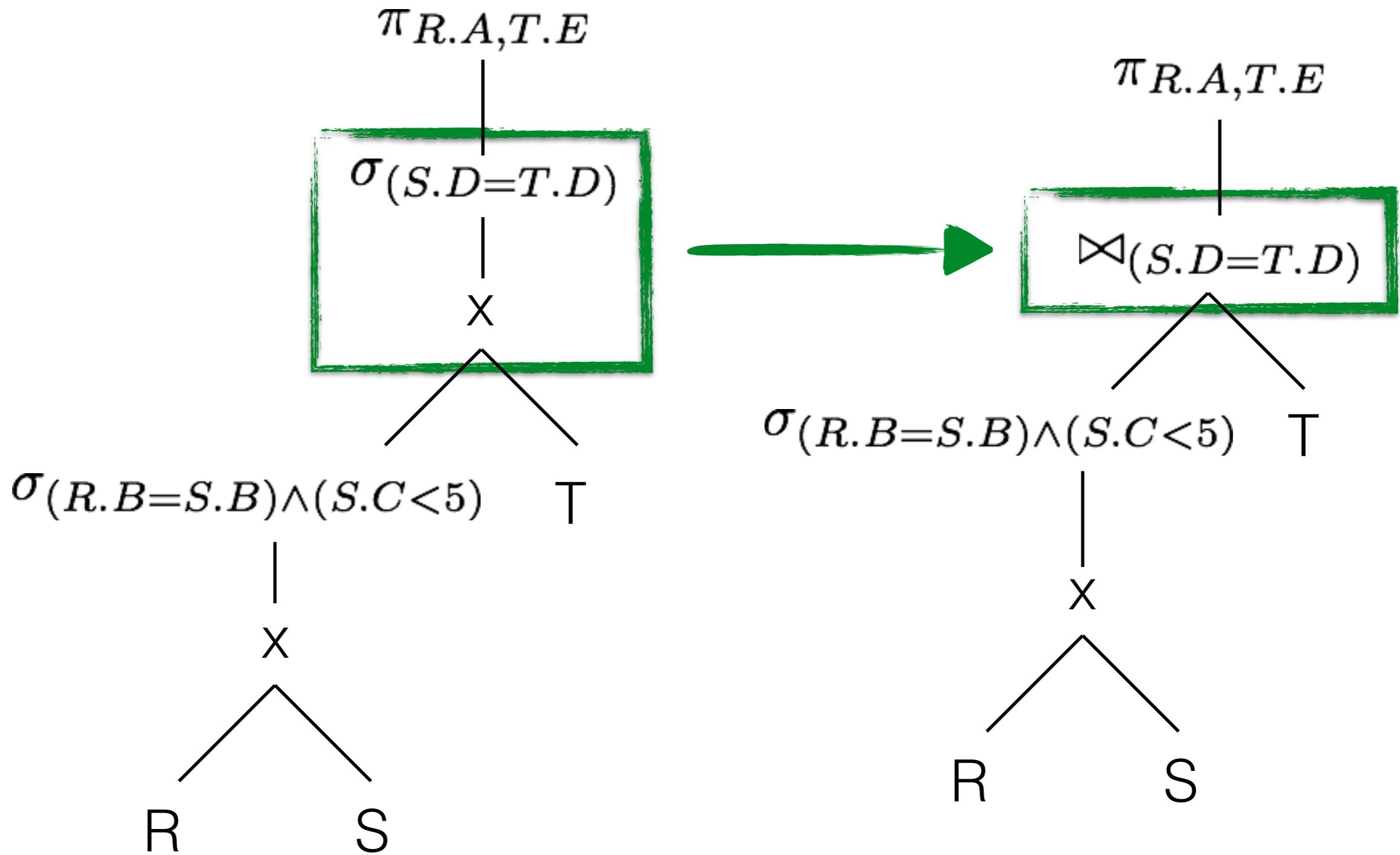
# Example



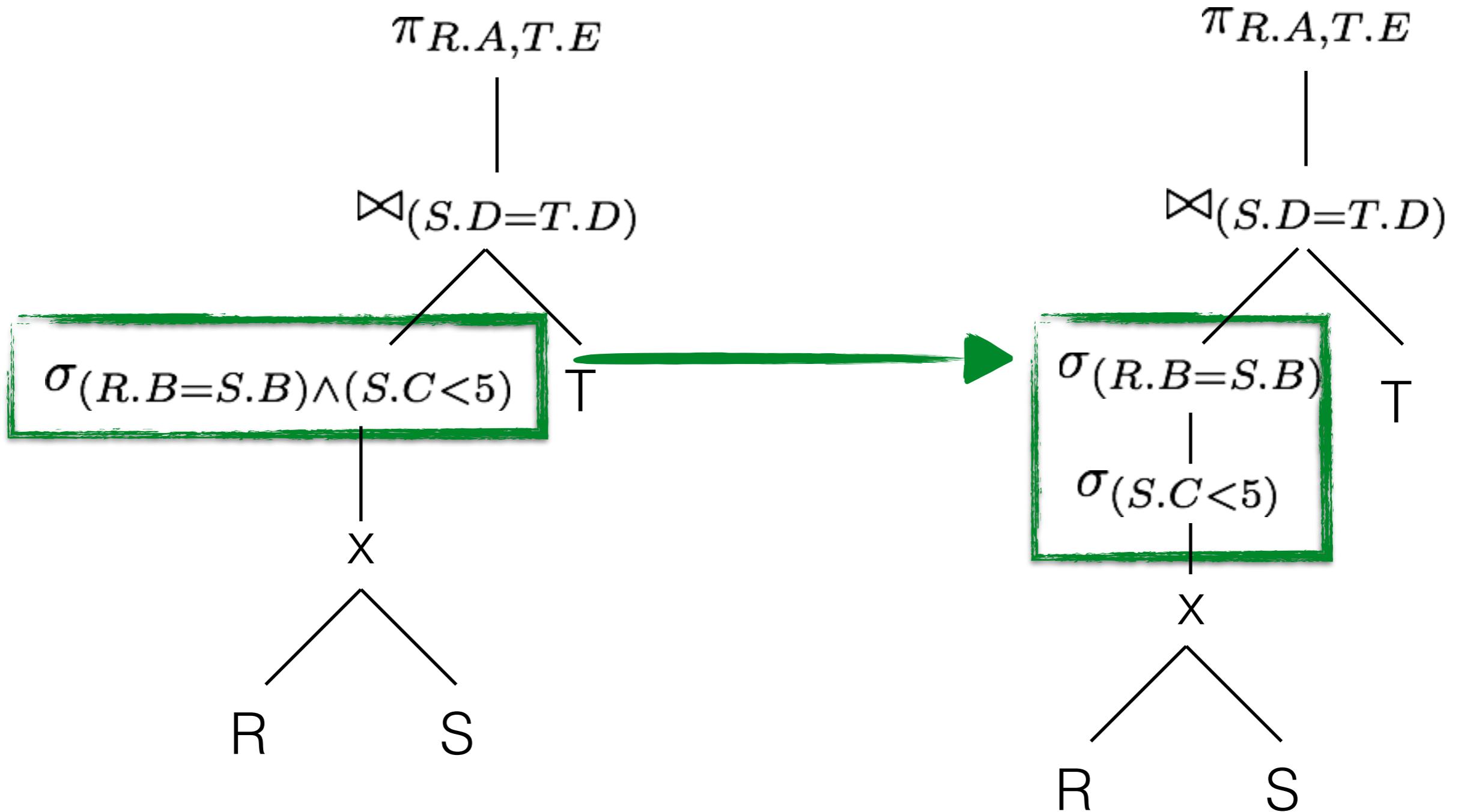
# Example



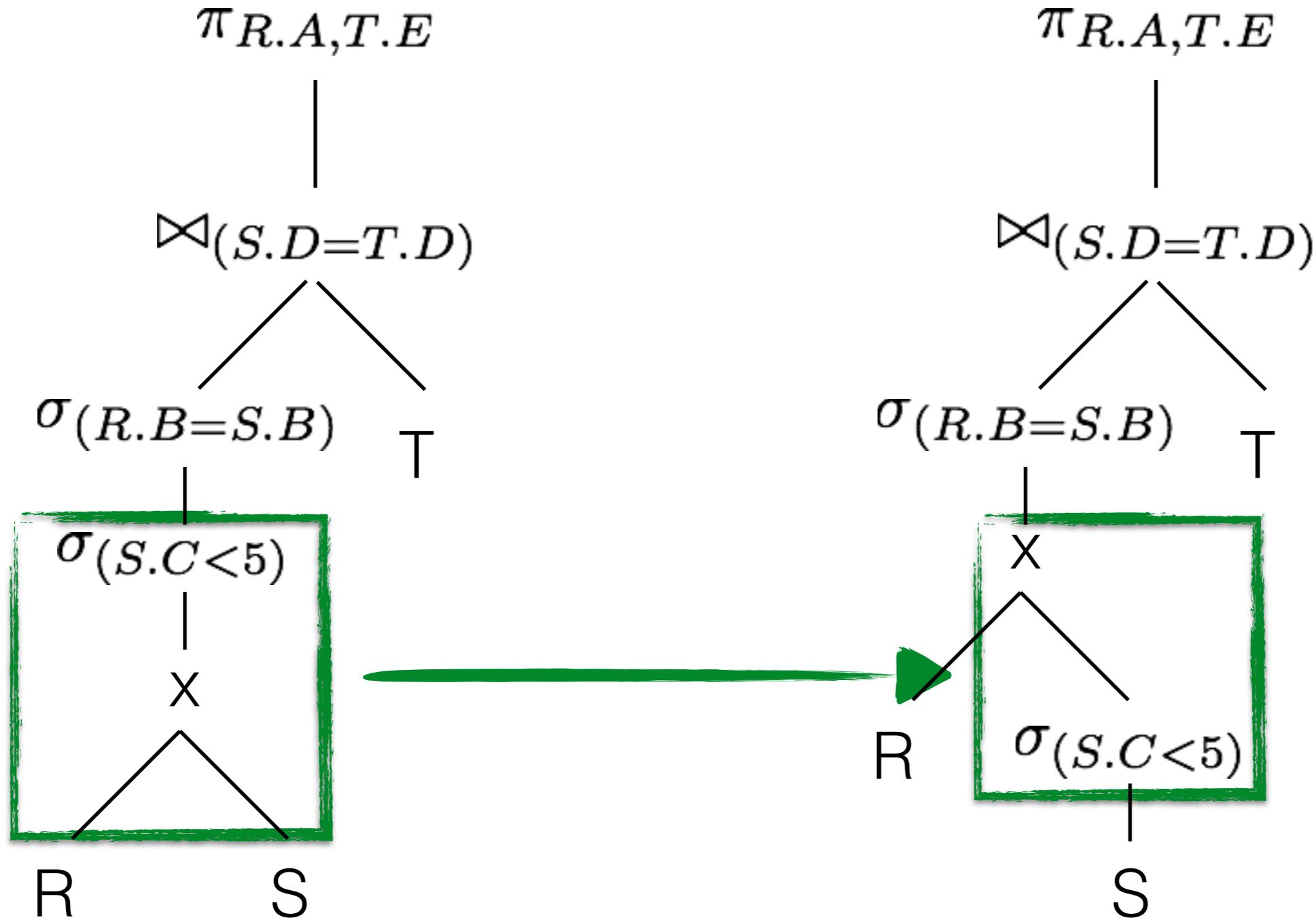
# Example



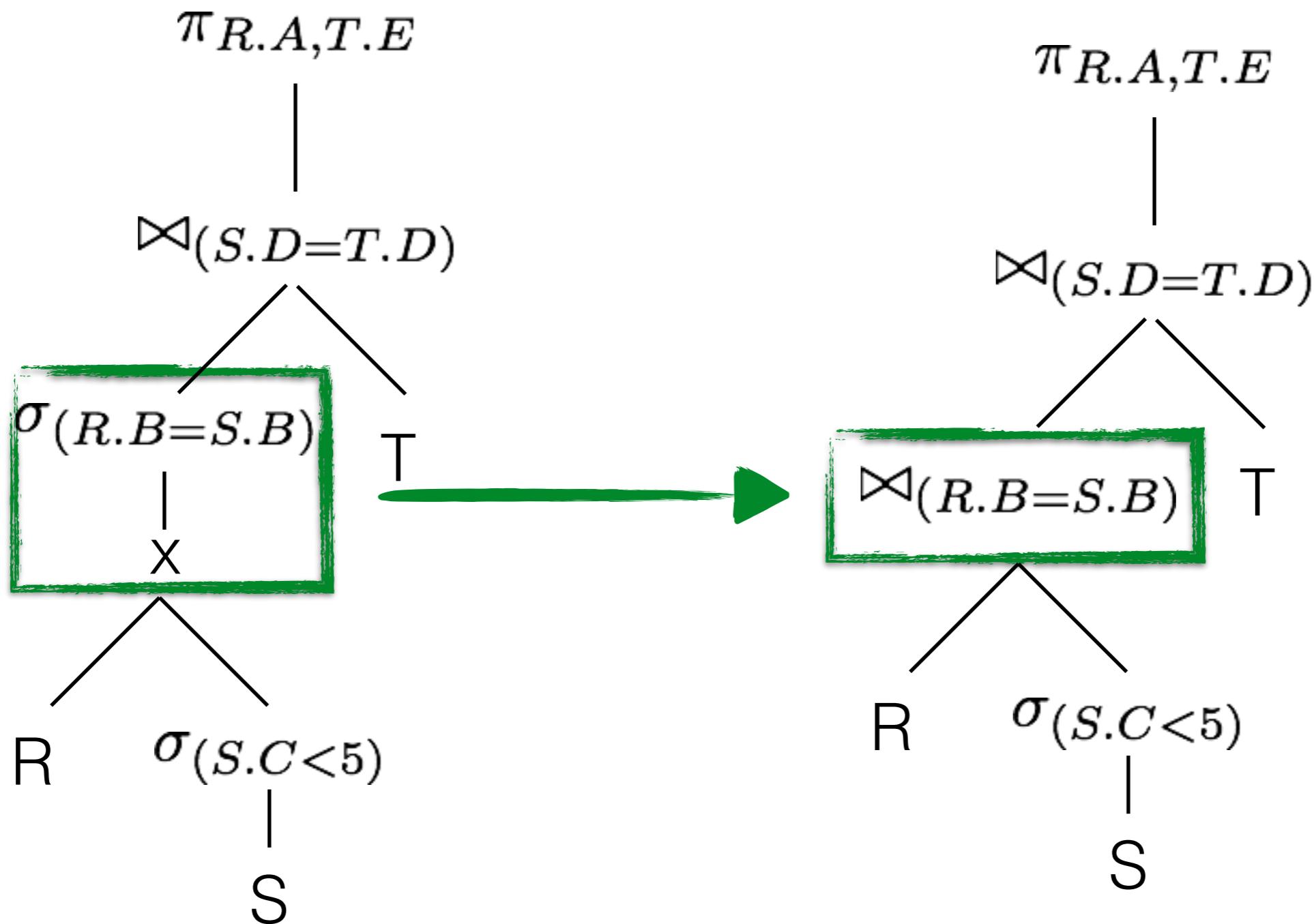
# Example



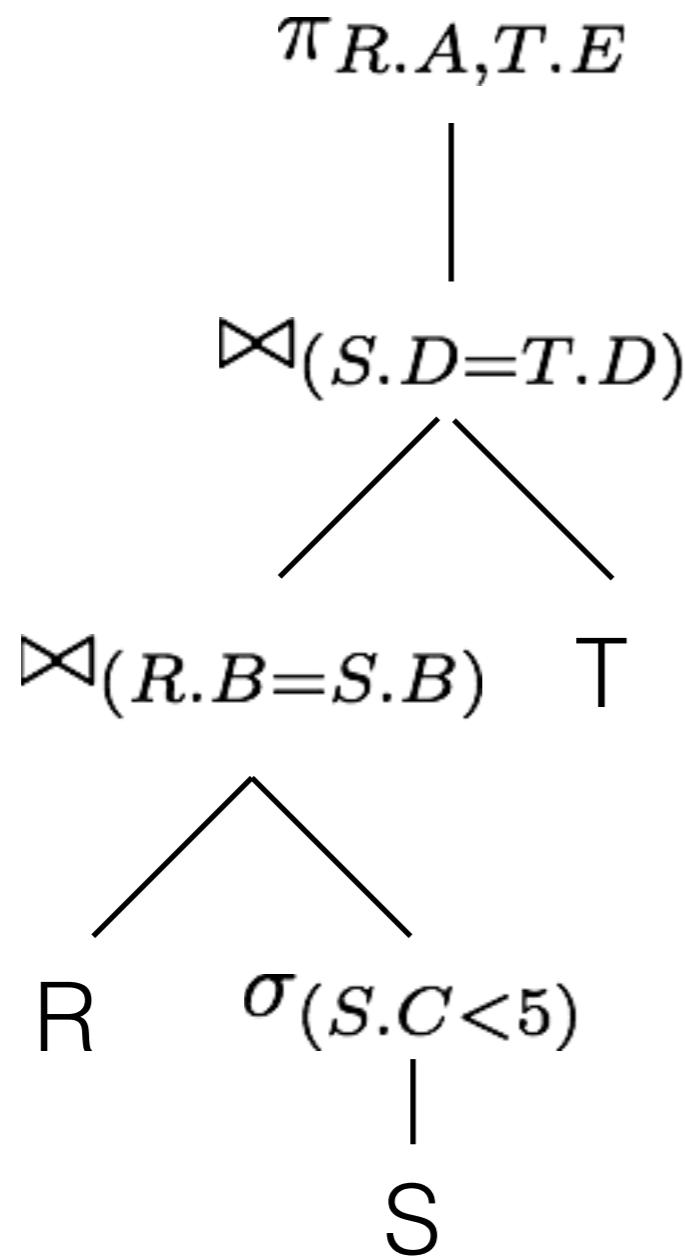
# Example



# Example



# Final Plan



```
SELECT R.A, T.E  
FROM R, S, T  
WHERE R.B = S.B  
AND S.C < 5  
AND S.D = T.D
```

# Optimization

- Find a pattern in the RA-Tree that you can optimize.
- Apply the optimization.
- Repeat as necessary. (more discussion later)

# Simple Optimizations (with a big impact)

- Pushdown Selections
- Build Joins
- [ Replace Unbounded Memory Operators ]

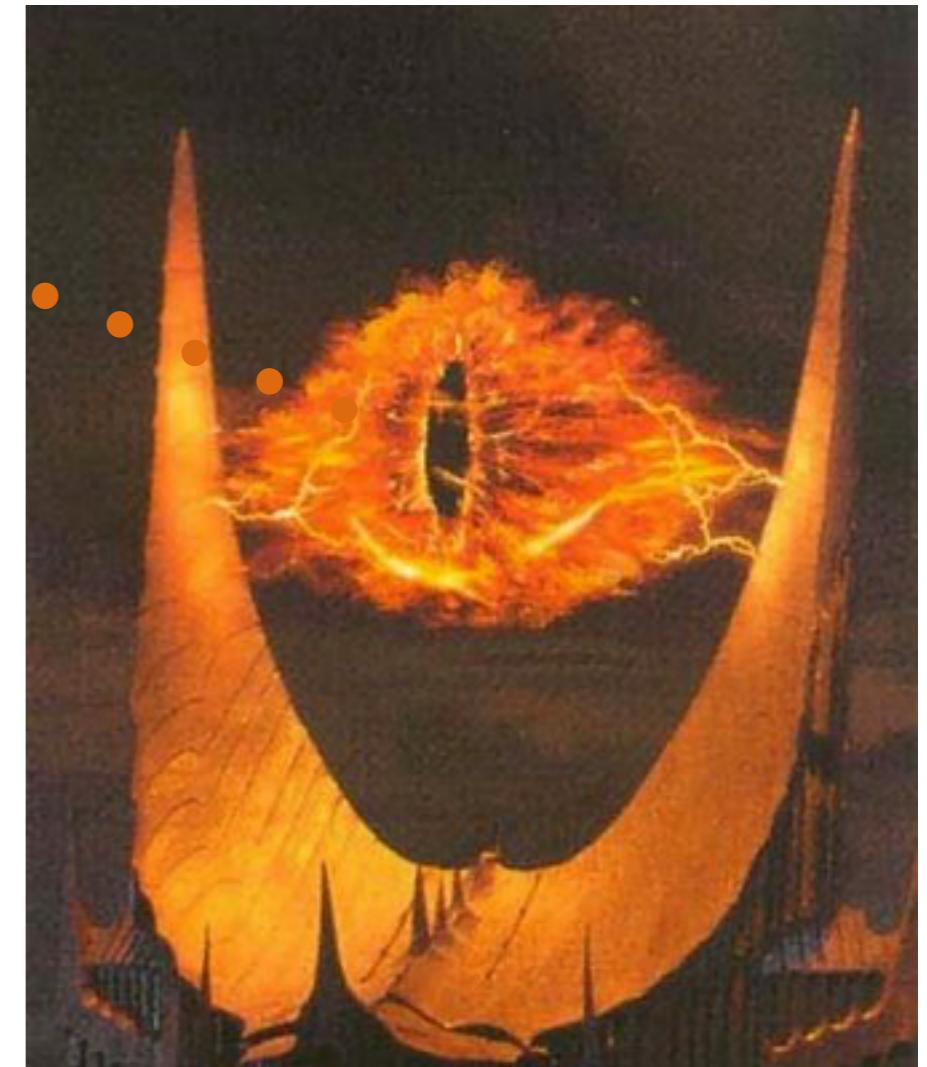
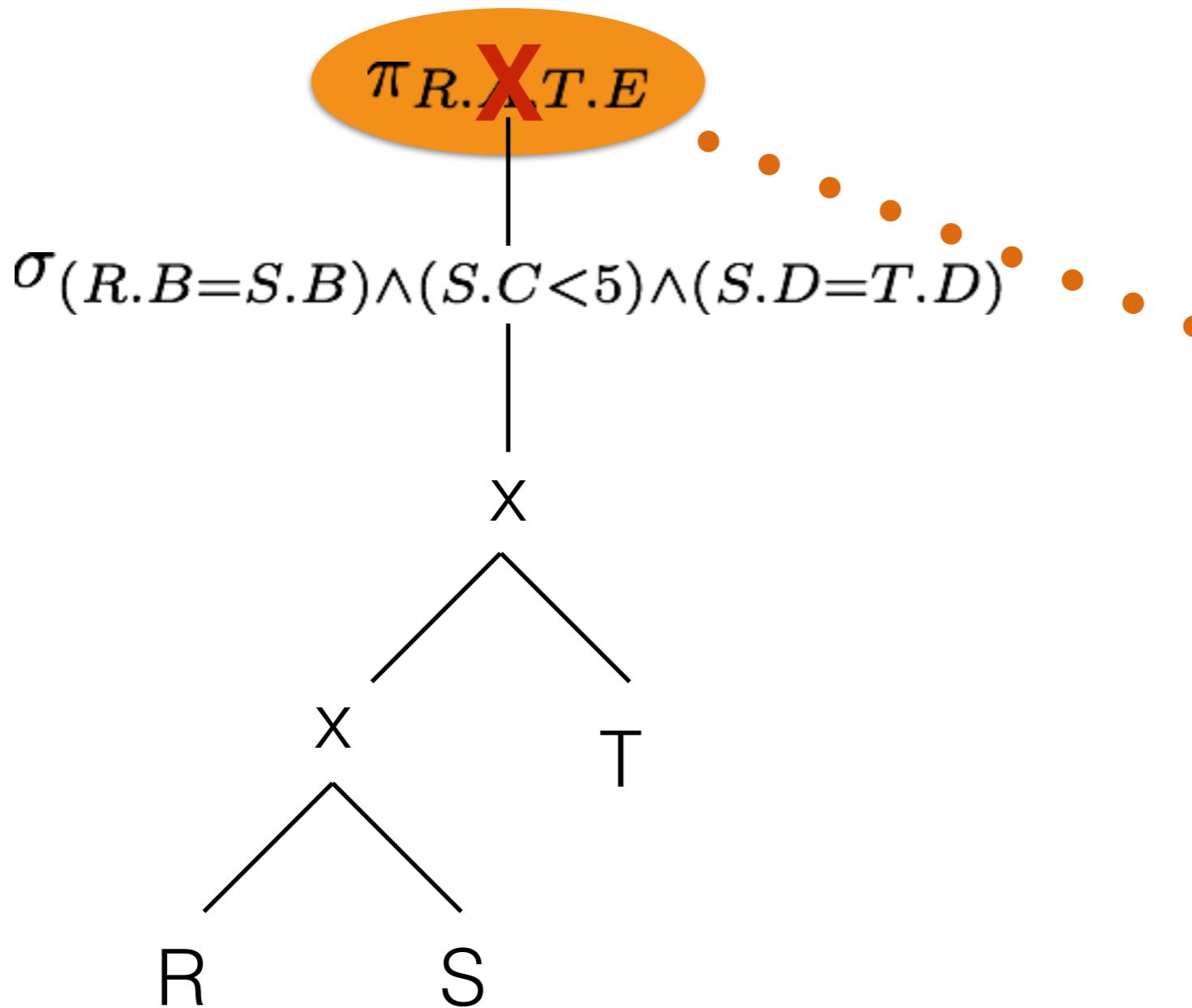
# Pushdown Selections

$$\sigma_{C_R \wedge C_S \wedge C}(R \times S) \equiv \sigma_C(\sigma_{C_R}(R) \times \sigma_{C_S}(S))$$

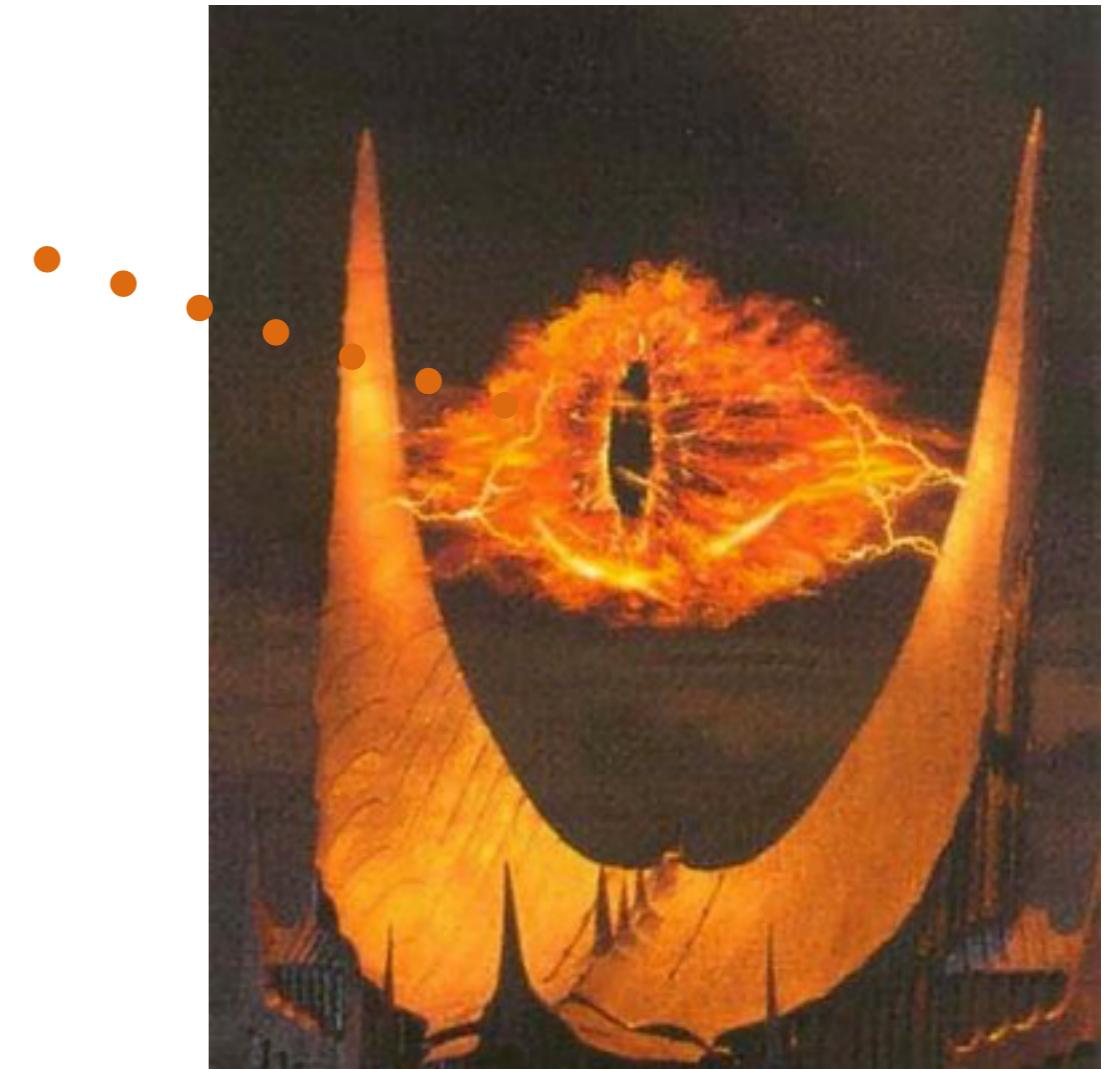
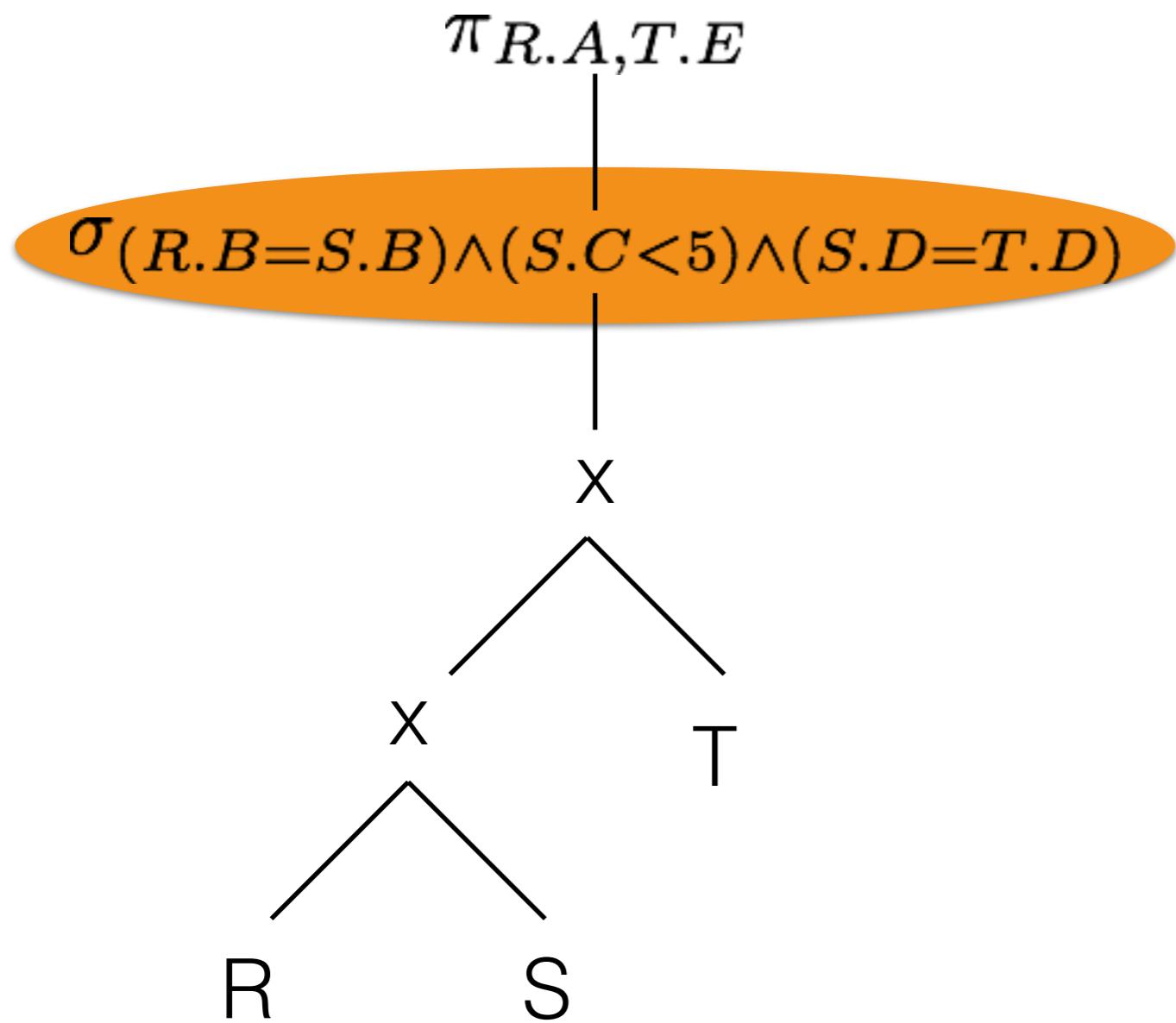
# Pattern Match/Replace

```
Operator rewrite(Operator o){  
    if(o instanceof Selection) {  
        Selection s = (Selection)o;  
        if(s.child() instanceof CrossProduct) {  
            // Magic happens here  
            return new ...;  
        }  
    }  
    return o;  
}
```

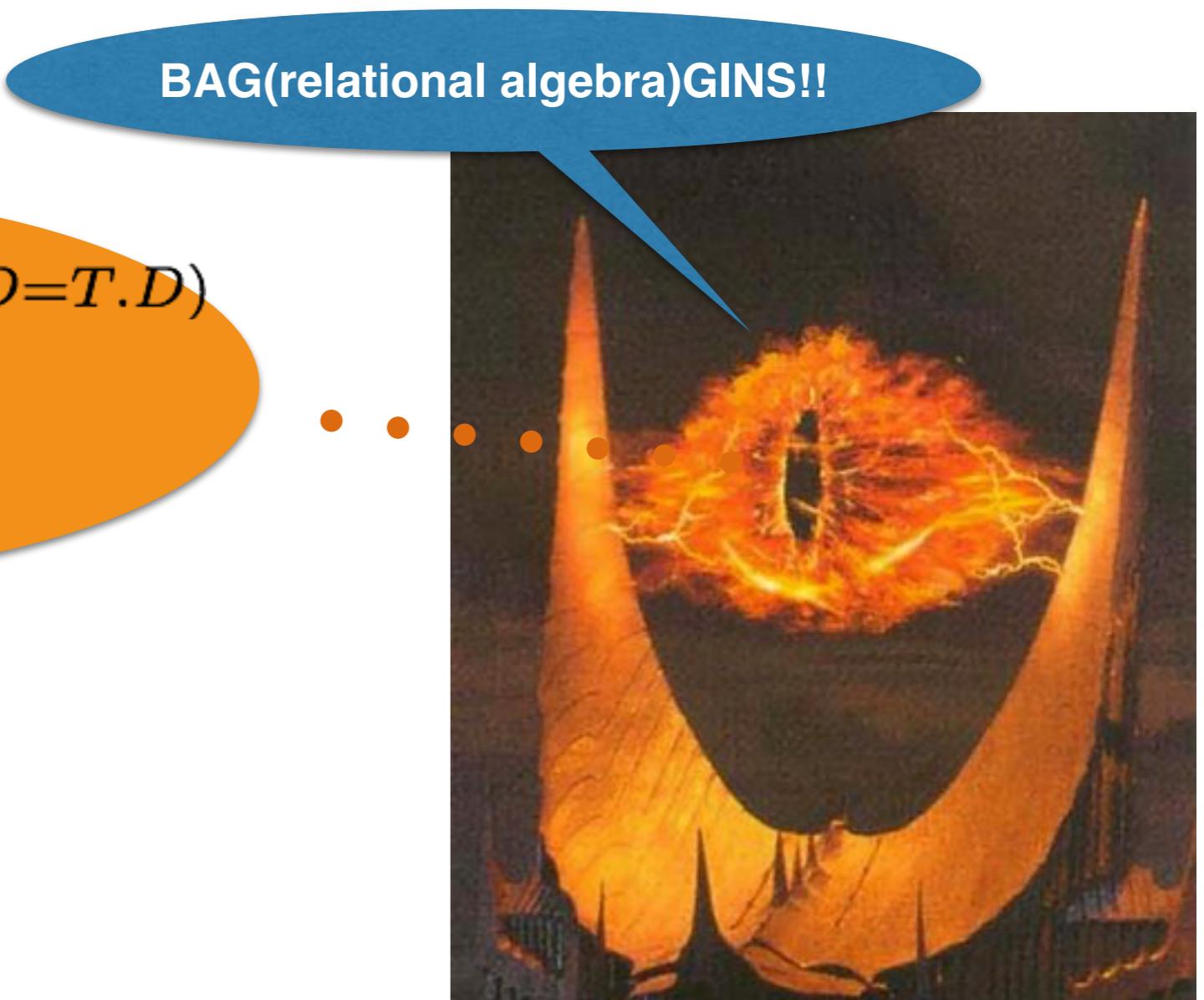
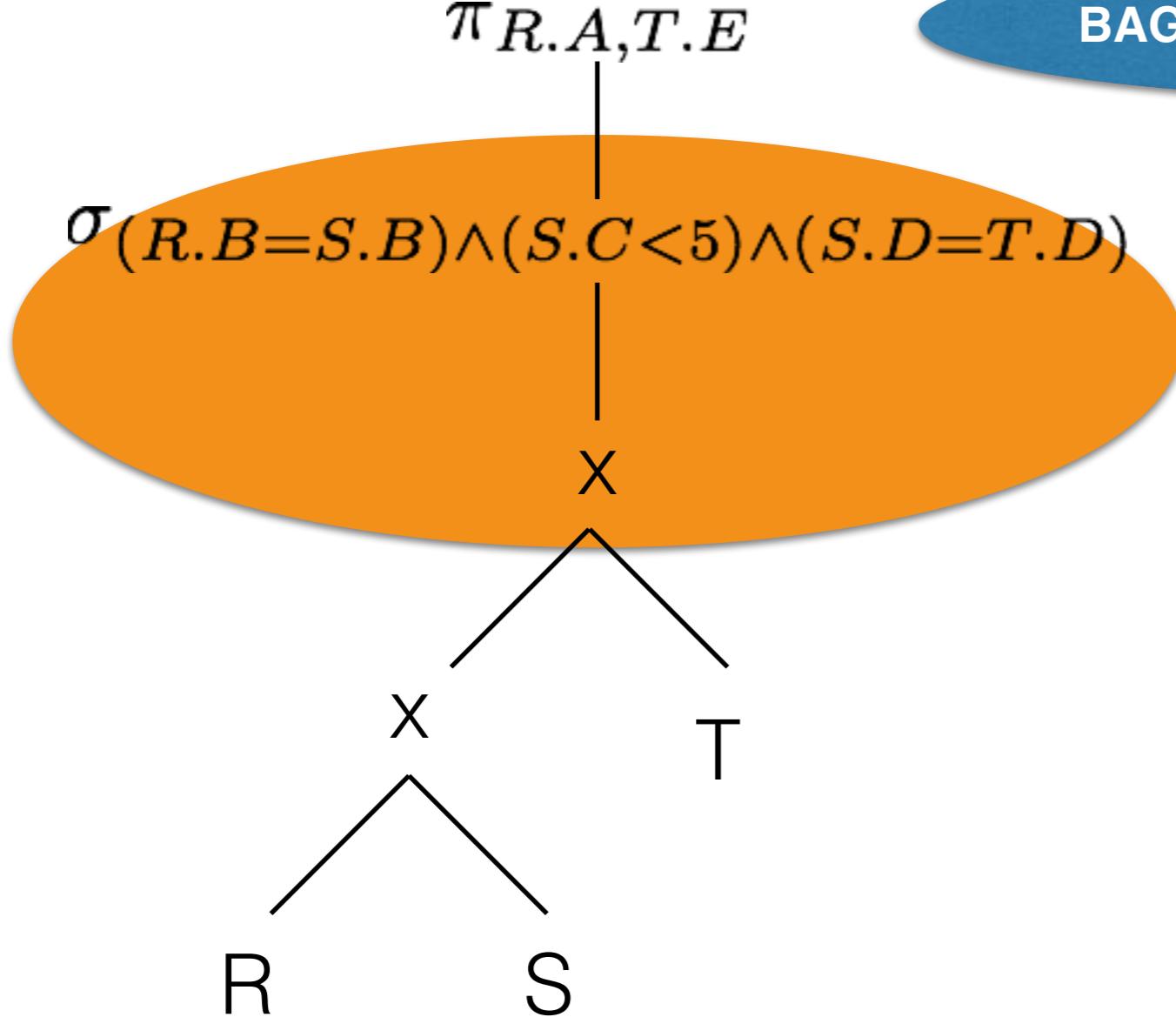
# Pattern Match/Replace



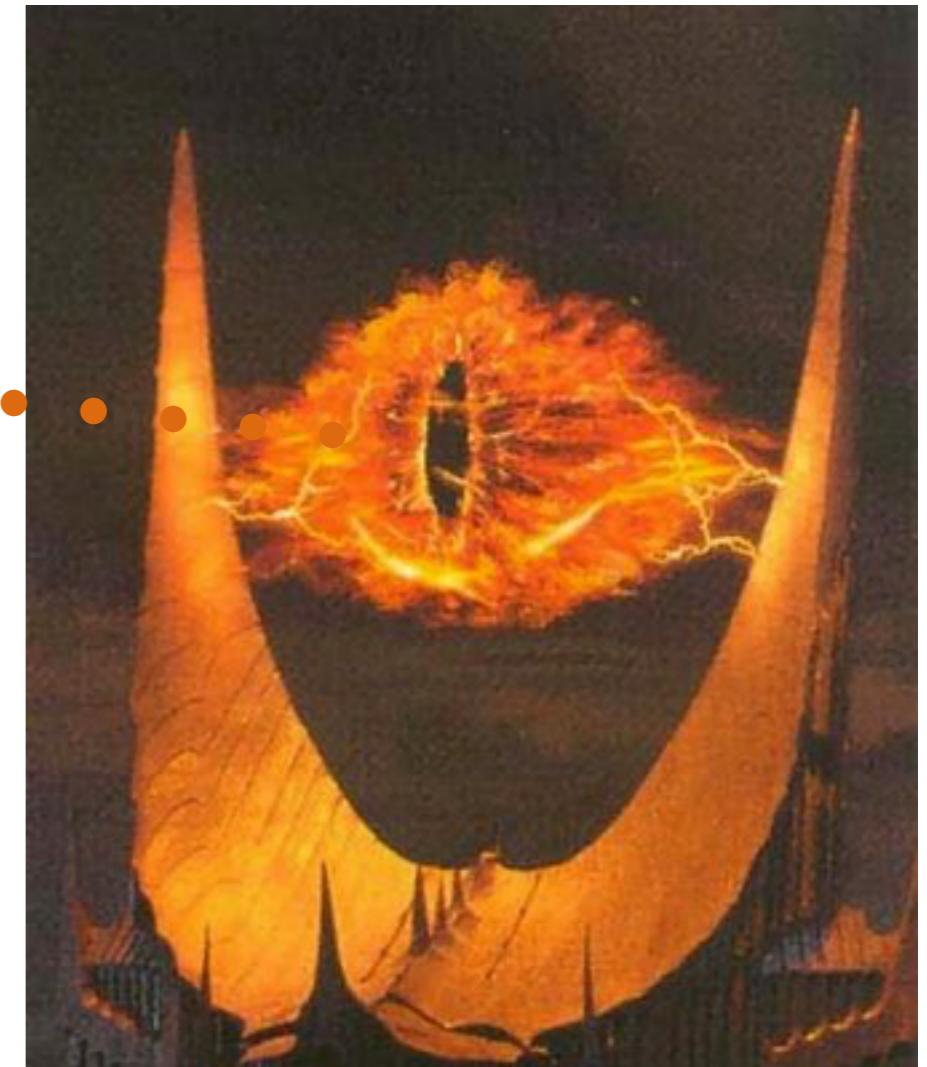
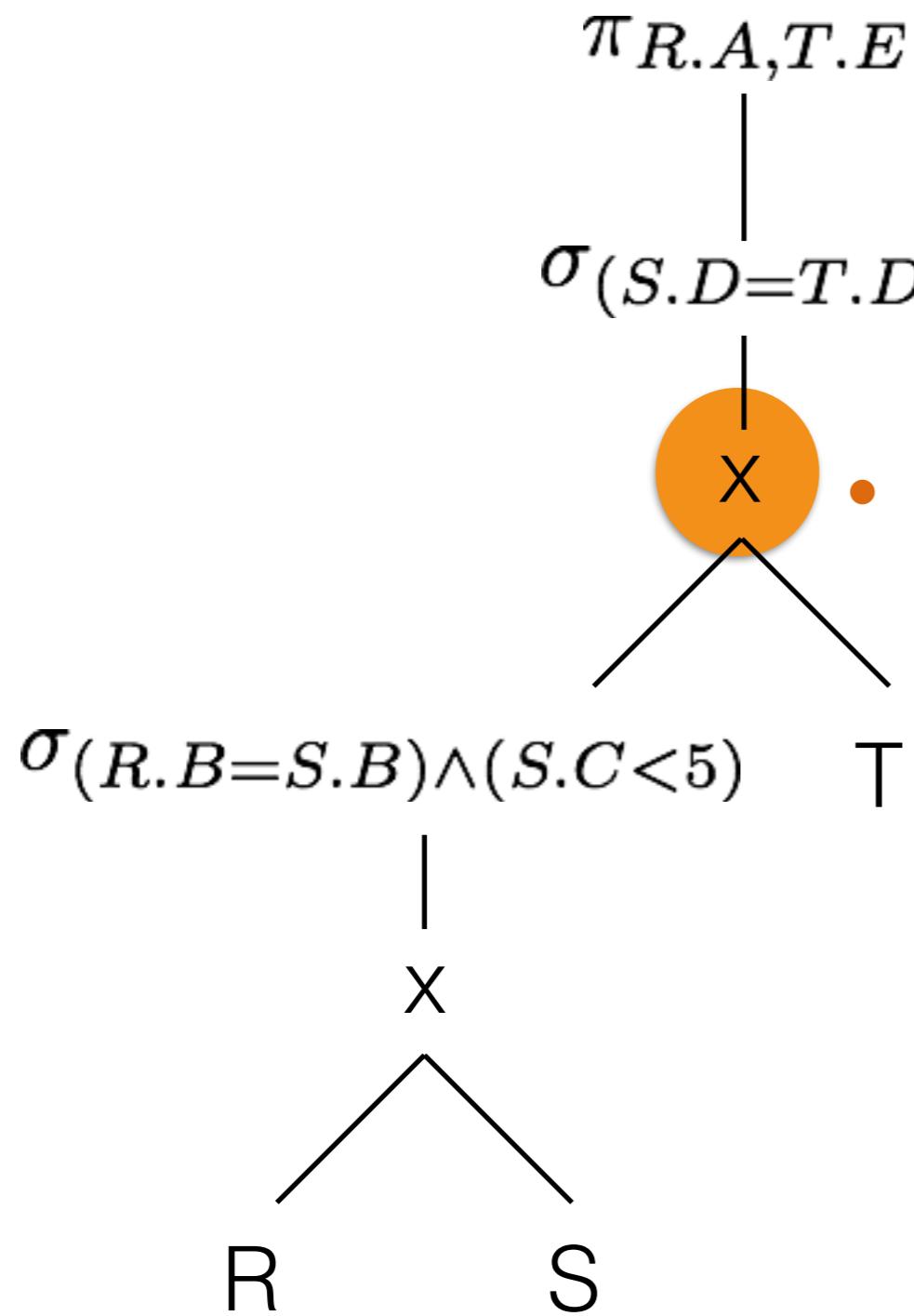
# Pattern Match/Replace



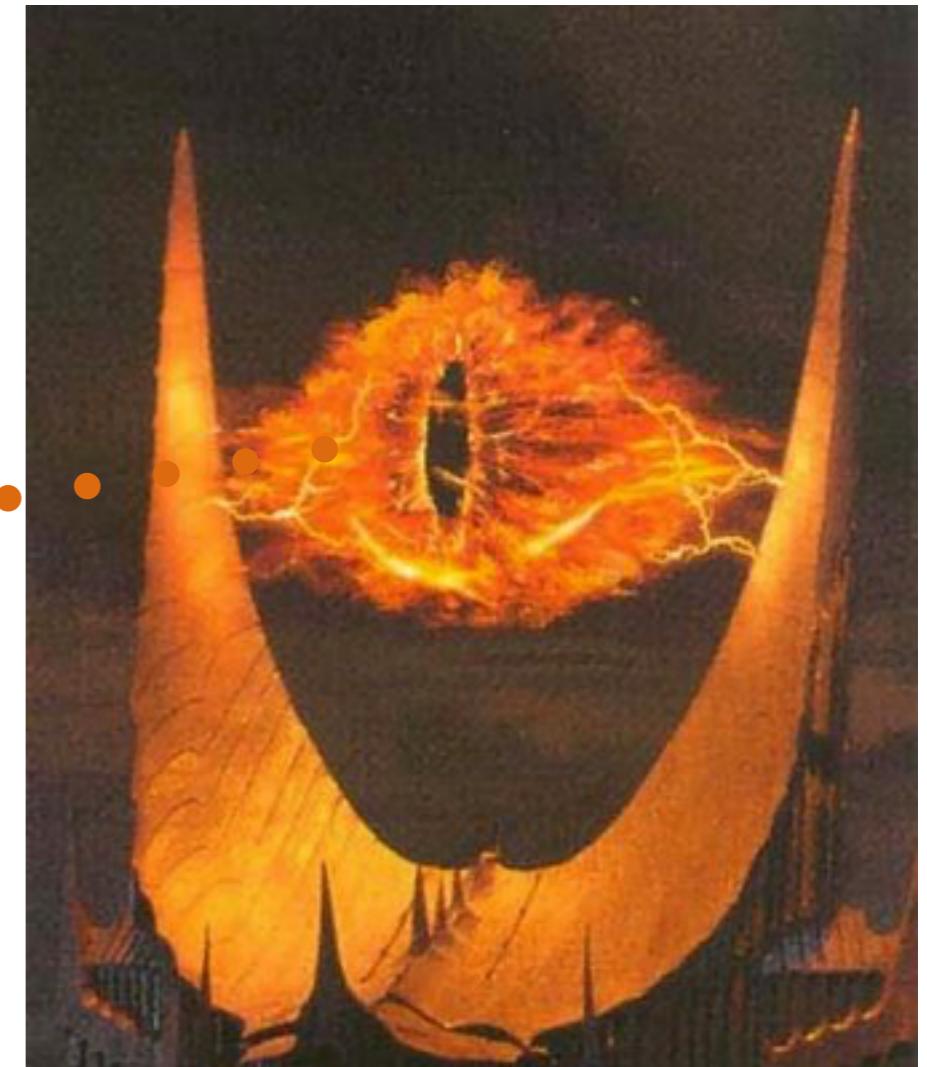
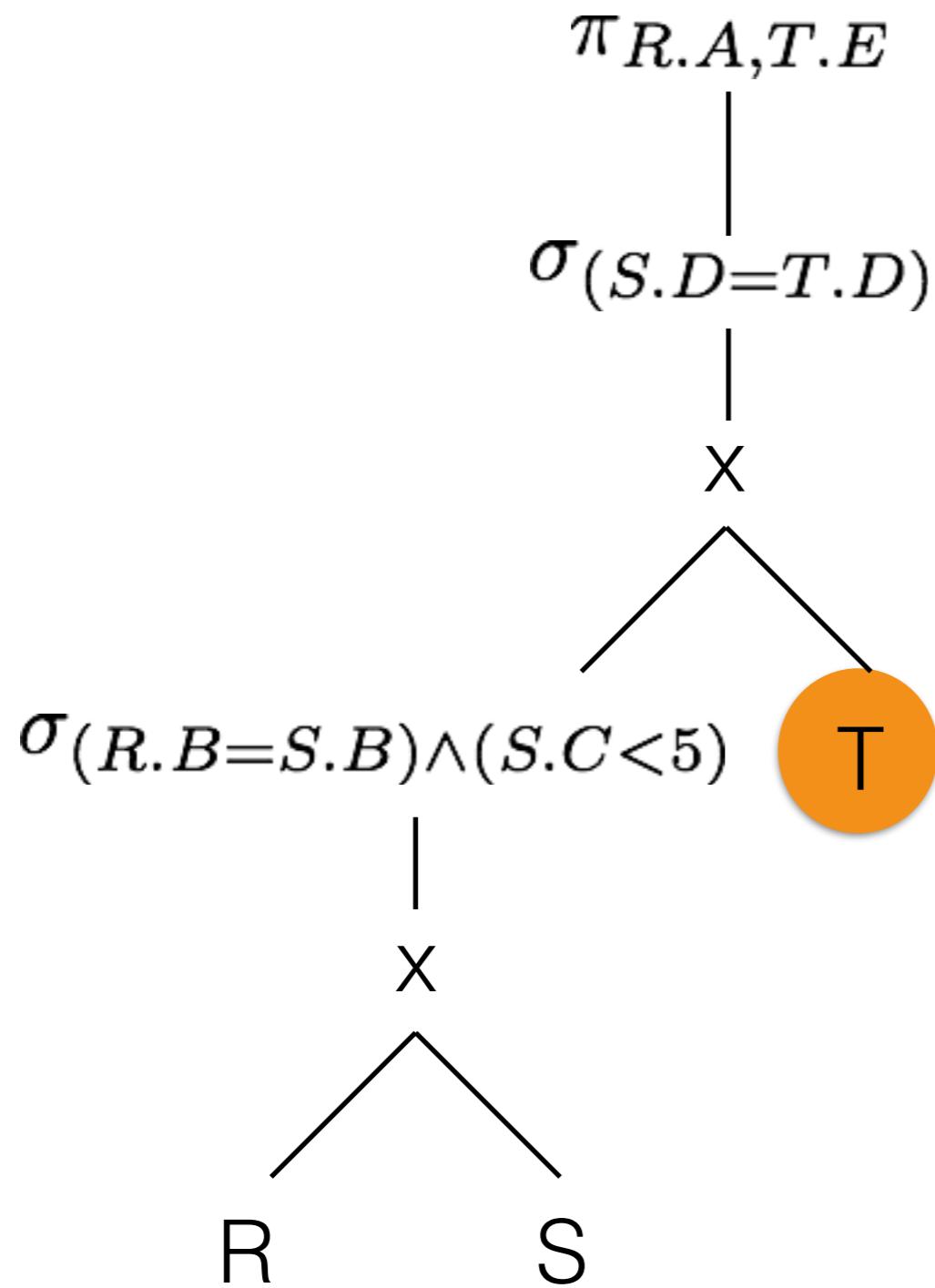
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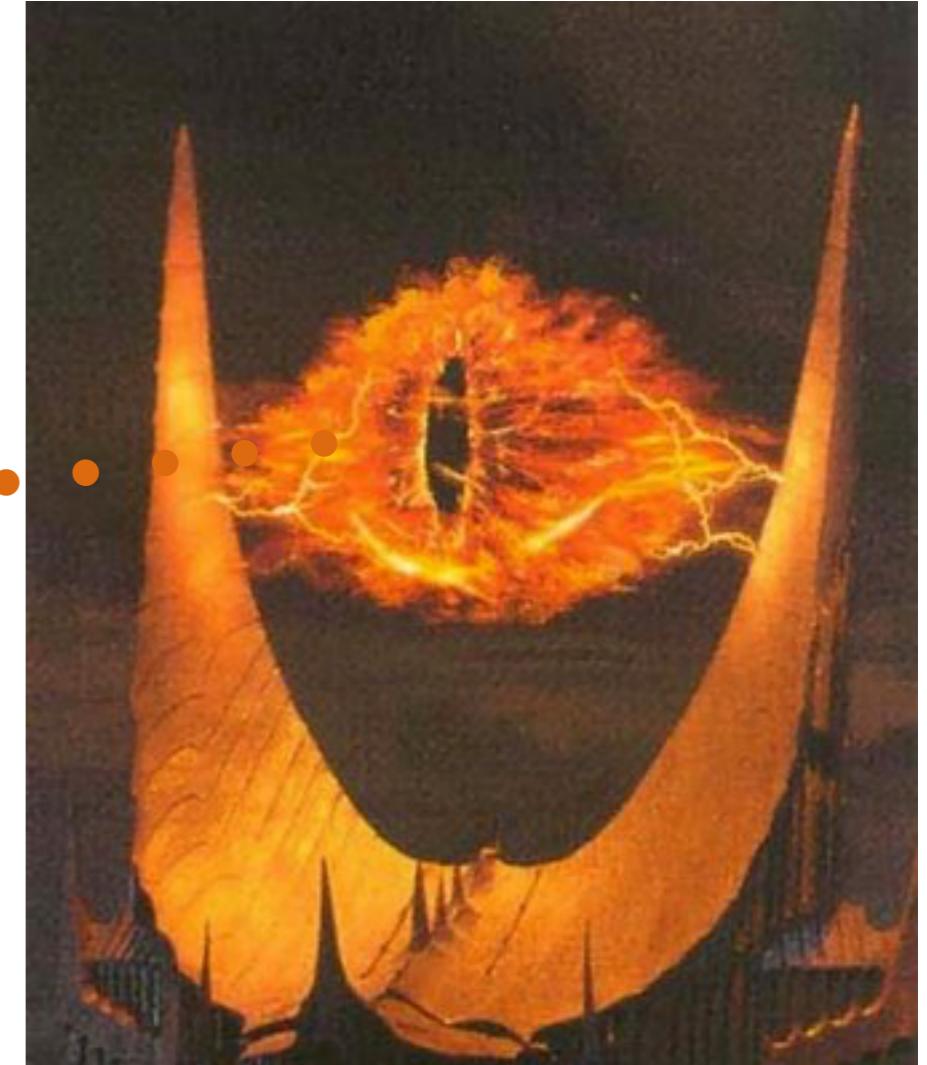
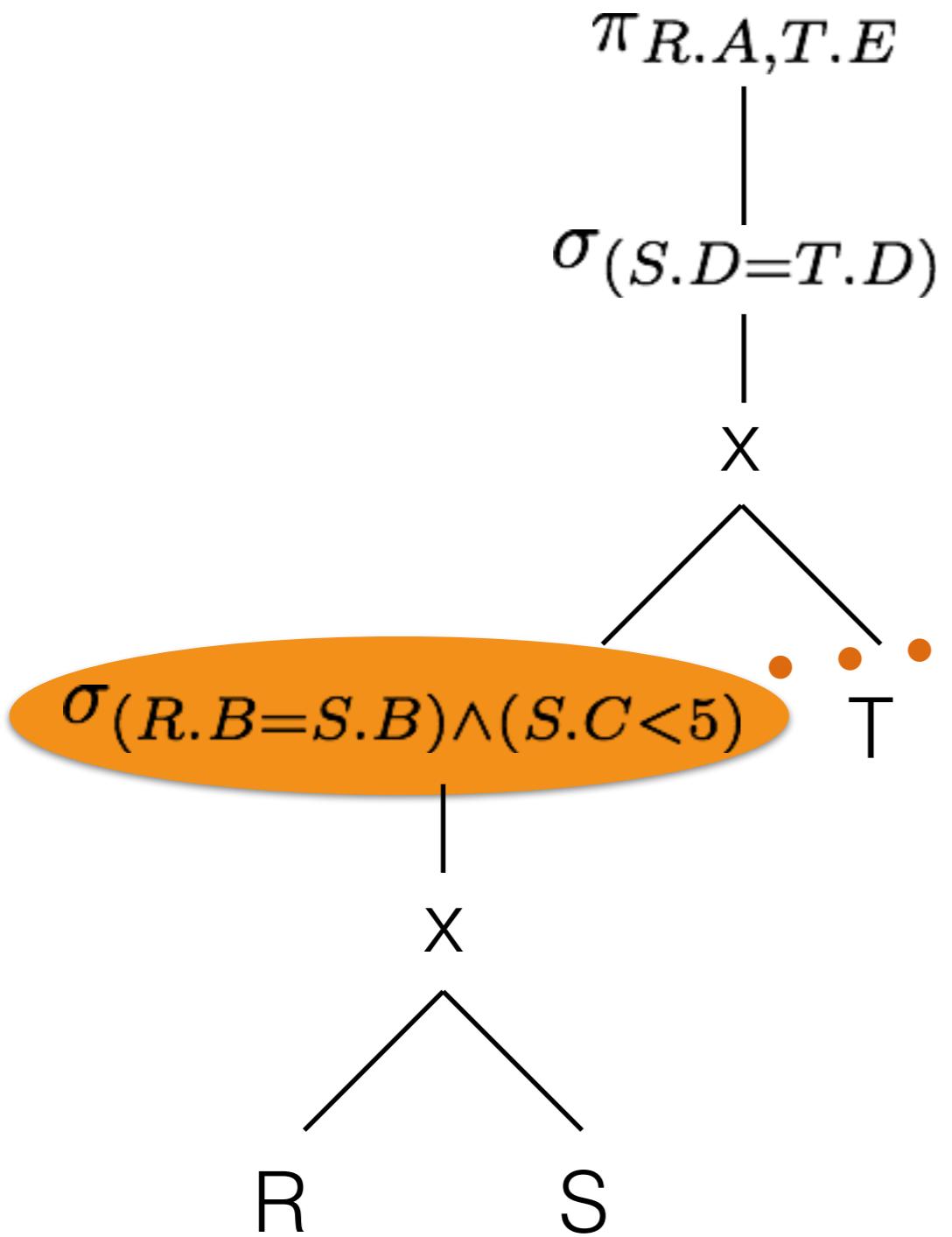
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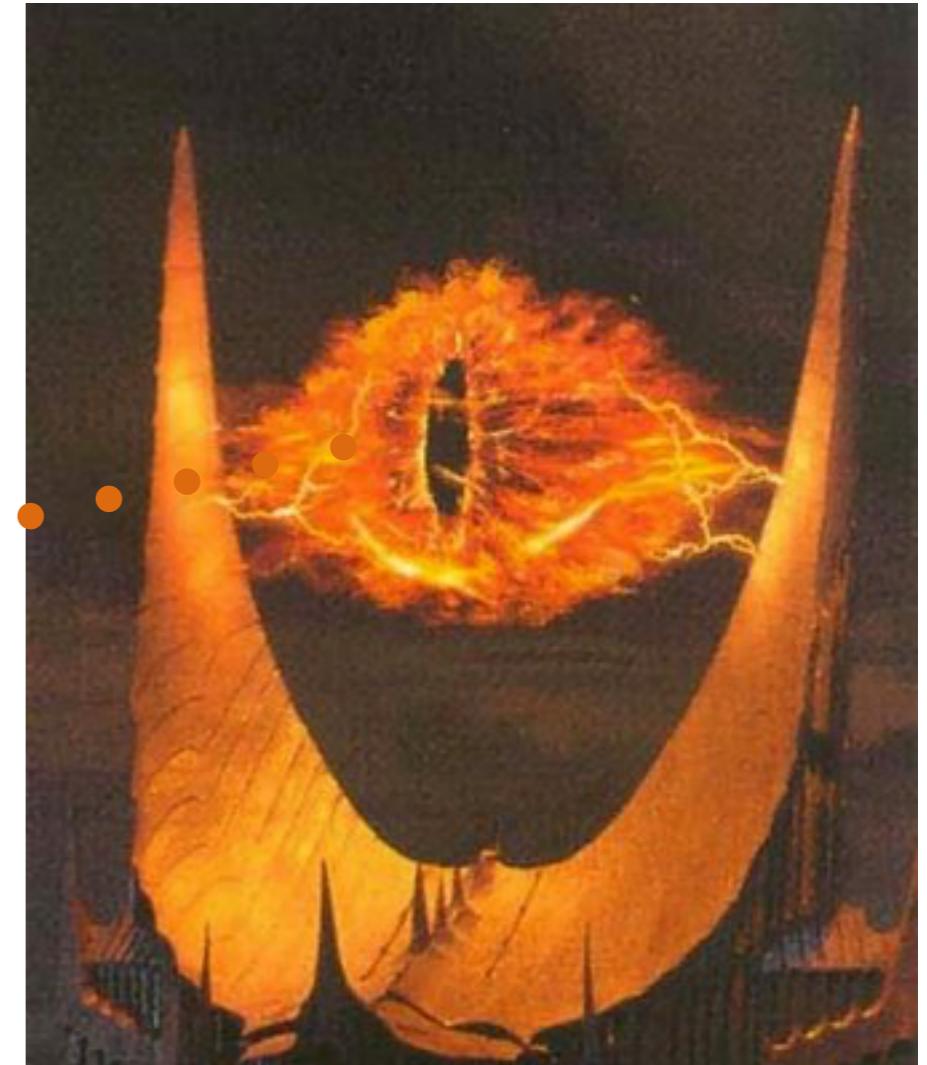
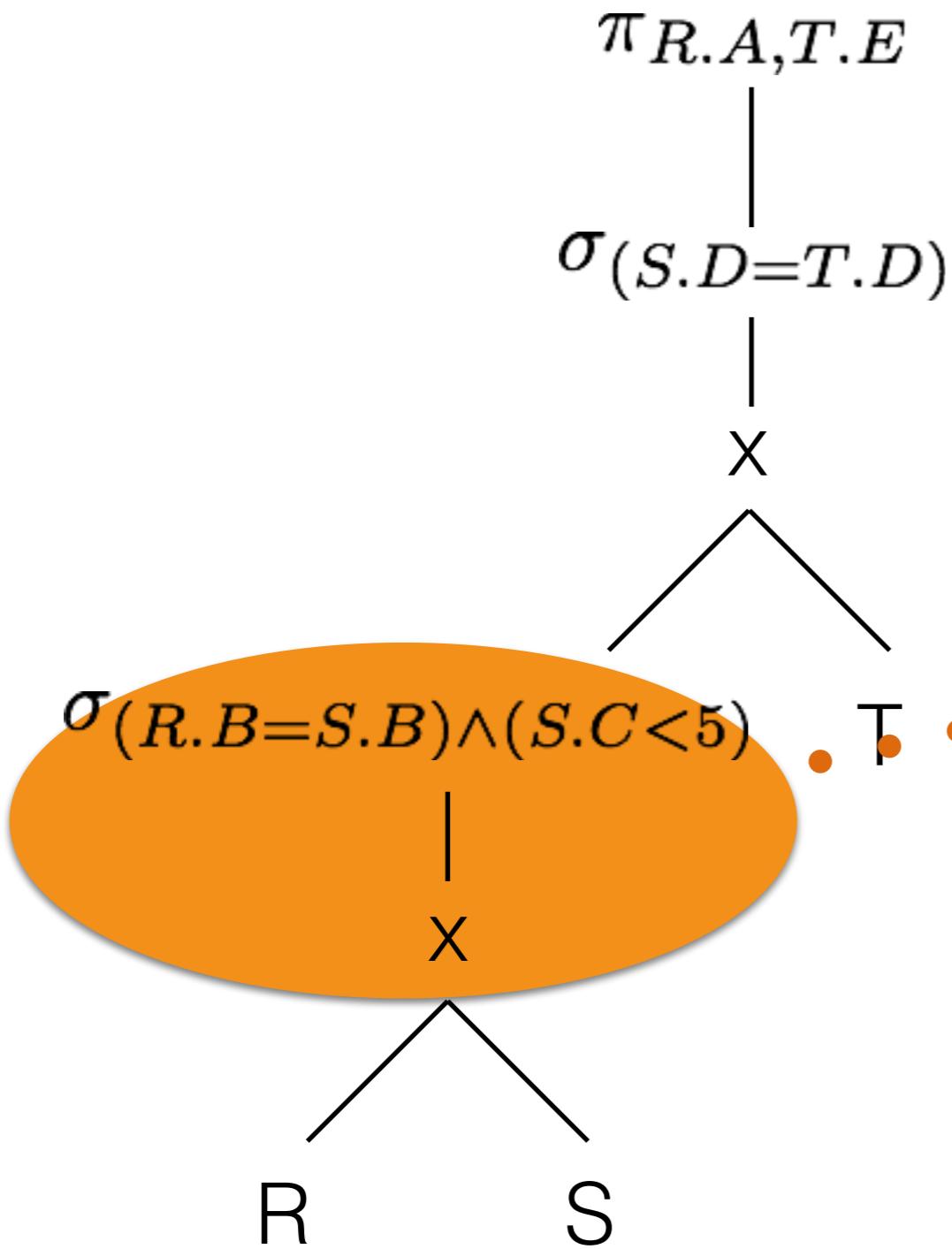
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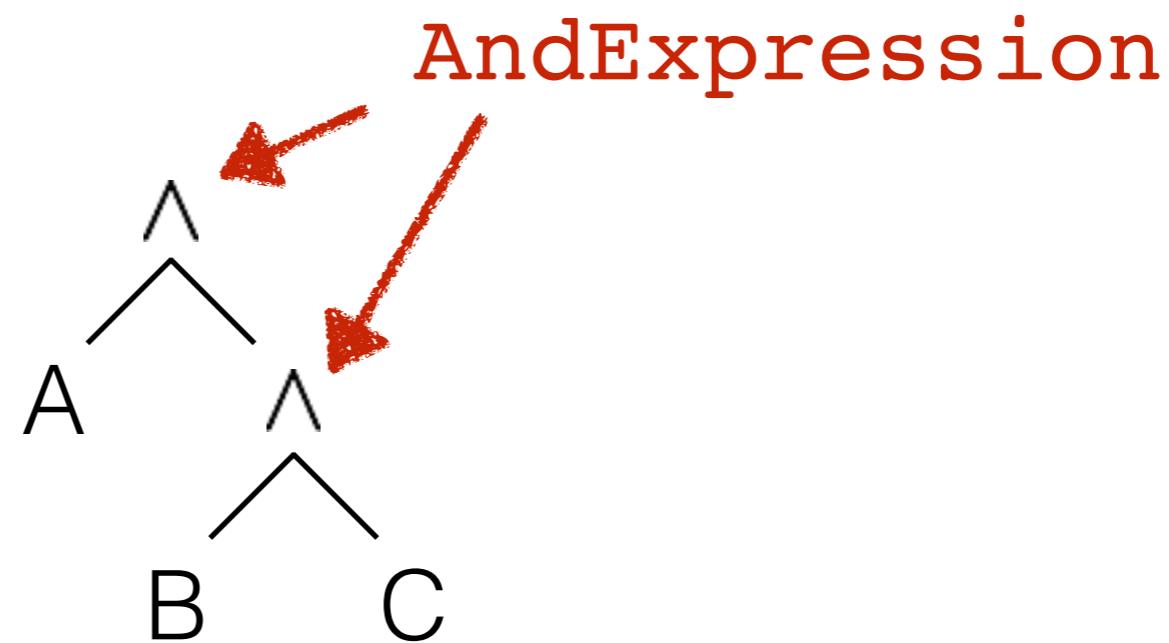


And so on...

# Conjunctive Clauses

A  $\wedge$  B  $\wedge$  C

# Conjunctive Clauses



# Conjunctive Clauses

```
List<Expression> andClauses(Expression e) {  
    if(e instanceof AndExpression) {  
        AndExpression a = (AndExpression)e;  
        return  
            andClauses(a.getLeftExpression()) .  
            addAll(  
                andClauses(a.getRightExpression())  
            );  
    } else {  
        return new List(e);  
    }  
}
```

# Expression Schemas

- Does the clause include only LHS columns?
  - **Push to the left**
- Does the clause include only RHS columns?
  - **Push to the right**
- Does the clause include both?
  - **Leave in place**

# Pushing Down Selection

[[ Optional ]]

$$\sigma_C(\pi_{A_i \leftarrow e_i}(R)) \equiv \pi_{A_i \leftarrow e_i}(\sigma_{C[A_i \setminus e_i]}(R))$$

**Replace columns  $A_i$  in  $C$  with  
the corresponding expression  $e_i$ .**

# Build Joins

- **Add a New Operator:** InMemHashJoin
- Start with a simple case for selections:
  - `if(clause instanceof EqualsTo) { ... }`
  - Replace Select+Product with a HashJoin
- More complex checks are possible...
  - ... but you'll quickly hit diminishing returns.

# Other Optimizations

- Partially Evaluate Expressions
  - useful with pushing selections through projections
- Push Down Projections
  - useful if your relation scan operator is projection-aware
- Reorder Joins
  - hard to do unless you gather statistics...

# When to “stop” optimizing

- Apply all optimization rules once (**ref impl does this**)
  - Be aware what order to apply them in.
  - Be aware of top-down vs bottom-up opts.
- Apply all rules N times.
- Apply rules up to a fixed point.

# TPC-H

- <http://www.tpc.org/tpch/>
  - Checkpoint 2 on-disk queries taken from TPC-H
  - All Checkpoint 3 queries taken from TPC-H

