

# Advanced SQL

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04 — Lists and Table-Generating Functions

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## 1 | Lists: Aliens(?) Inside Table Cells

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SQL tables adhere to the **First Normal Form (1NF)**: values  $v$  inside table cells are *atomic* w.r.t. the tabular data model:

...	A	...
...	$v$	...

Let us now discuss the **list** data type:

- $v$  may hold an ordered list of elements  $[x_1, \dots, x_n]$ .
- SQL treats  $v$  as an atomic unit, but ...
- ... list functions and operators also enable SQL to query the  $x_i$  individually (still, that's no  $\nrightarrow$  with 1NF).

## 2 | List Types

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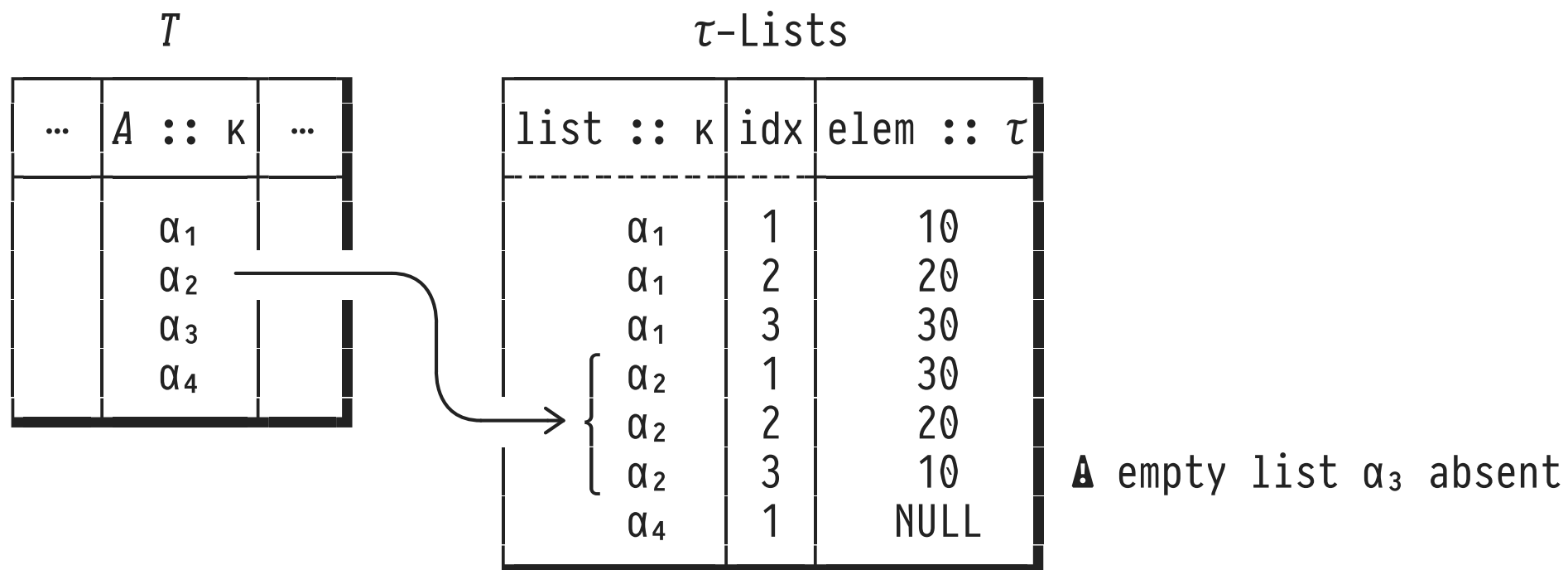
- For type  $\tau$ ,  $\tau[]$  is the type of **homogeneous lists of elements of  $\tau$** .
  - $\tau$  may be built-in or user-defined (enums, row types).
  - List size is unspecified—the list is dynamic.  
(DuckDB also implements  $\tau[n]$ , the type of **arrays of fixed length  $n$** .)

...	$A :: \text{int}[]$	...
...	[10, 20, 30]	...
...	[30, 20, 10]	...
...	[]	...
...	[NULL]	...

$T$

# “Simulating” Lists (Tabular List Semantics)

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- $\kappa$  denotes a suitable key data type.
- List indexes are of type `int` and 1-based.

### 3 | List Literals

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#### One-dimensional list literals of type $\tau[]$ :

$[] :: \tau[]$                       empty list of elements of type  $\tau$

$[x_1, \dots, x_n]$   
 $\text{list\_value}(x_1, \dots, x_n)$

} all  $x_i$  of type  $\tau$

#### Multi-dimensional list literals of type $\tau[][]$ :

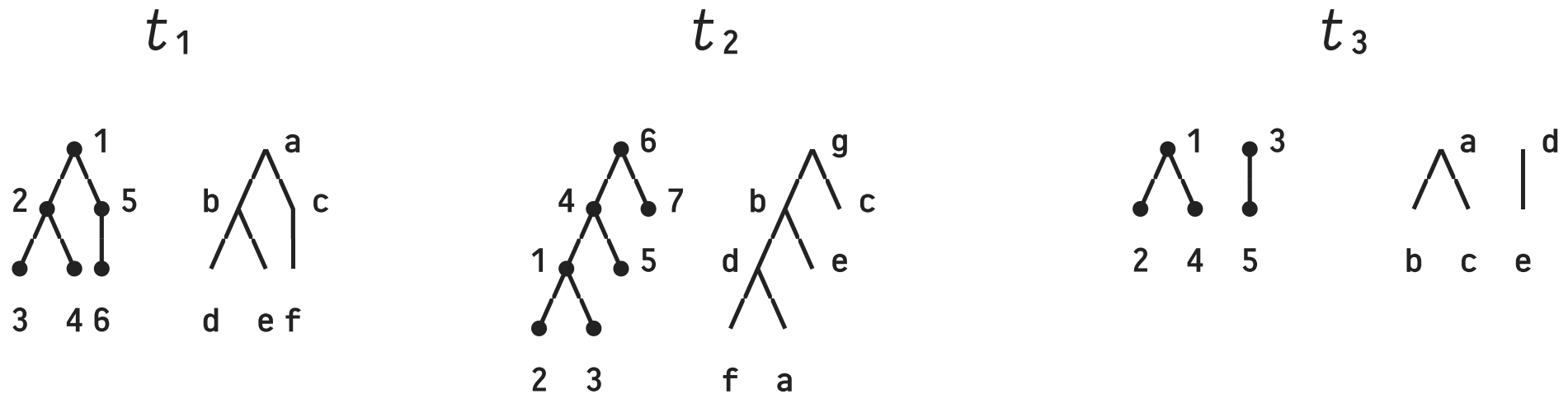
$[[x_{11}], [], [x_{31}, x_{32}]]$  (ragged)

matrix: all sub-lists agree in size

$\underbrace{[x_{11}, \dots, x_{1n}]}_{\text{size } n}, \dots, \underbrace{[x_{k1}, \dots, x_{kn}]}_{\text{size } n}$

$\begin{matrix} 1 & \blacksquare & \blacksquare & \blacksquare & \blacksquare \\ \vdots & \blacksquare & \blacksquare & \blacksquare & \blacksquare \\ k & \blacksquare & \blacksquare & \blacksquare & \blacksquare \end{matrix}$   
 $\quad \quad \quad 1 \dots n$

# Example: Tree Encoding ( $\text{parents}[i] \equiv \text{parent of node } i$ )



Tree shape and node labels held in separate in-sync lists:

tree	parents	labels
$t_1$	[NULL, 1, 2, 2, 1, 5]	['a', 'b', 'd', 'e', 'c', 'f']
$t_2$	[4, 1, 1, 6, 4, NULL, 6]	['d', 'f', 'a', 'b', 'e', 'g', 'c']
$t_3$	[NULL, 1, NULL, 1, 3]	['a', 'b', 'd', 'c', 'e']
	1 2 3 4 5	1 2 3 4 5 $\leftarrow$ index $i$

Trees

## Constructing Lists

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- **Append/prepend** element  $\ast$  to list or
- **concatenate** lists:

$$\text{list\_append}([x_1, \dots, x_n], \ast) \equiv [x_1, \dots, x_n, \ast]$$

$$\text{list\_prepend}(\ast, [x_1, \dots, x_n]) \equiv [\ast, x_1, \dots, x_n]$$

$$\text{list\_concat}([x_1, \dots, x_n], [y_1, \dots, y_m]) \equiv [x_1, \dots, x_n, y_1, \dots, y_m]$$

$$[x_1, \dots, x_n] \parallel [y_1, \dots, y_m] \equiv [x_1, \dots, x_n, y_1, \dots, y_m]$$

- Academics: “List type  $\tau[]$  forms a monoid  $(\tau[], \parallel, [])$  with commutative operation  $\parallel$  and neutral element  $[]$ .”

## Accessing List Elements: Indexing / Slicing

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- List **indexes**  $i$  are 1-based (let  $xs \equiv [x_1, x_2, \dots, x_n]$ ):

$xs[i]$	$\equiv x_i$	$(1 \leq i \leq n)$
$(\text{NULL})[i]$	$\equiv \text{NULL}$	
$xs[\text{NULL}]$	$\equiv \text{NULL}$	
$xs[i:j]$	$\equiv [x_i, \dots, x_j]$	$(i > j: [])$
$xs[i:]$	$\equiv [x_i, \dots, x_n]$	
$xs[:j]$	$\equiv [x_1, \dots, x_j]$	

- Access the last element / from the list back:

$xs[\text{len}(xs)]$	$\equiv x_n$	
$xs[-i]$	$\equiv x_{n-(i-1)}$	$(1 \leq i \leq n)$



## Searching for Elements in Lists

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Indexing accesses lists by position. **Searching** accesses list by **contents**, instead.

- Let  $xs \equiv [x_1, \dots, x_{i-1}, *, x_{i+1}, \dots, x_{j-1}, *, x_{j+1}, \dots, x_n]$  and comparison operator  $\theta \in \{=, <, >, <>, <=, >=\}$ :

$x \theta \text{ ANY}(xs)$	$\equiv$	$\exists i \in \{1, \dots, n\}: x \theta xs[i]$
$x \theta \text{ ALL}(xs)$	$\equiv$	$\forall i \in \{1, \dots, n\}: x \theta xs[i]$
<b>list_has</b> ( $xs, x$ )	$\equiv$	$x = \text{ANY}(xs)$
<b>list_has_any</b> ( $xs, [y_1, \dots, y_m]$ )	$\equiv$	$\exists i \in \{1, \dots, m\}: y_i = \text{ANY}(xs)$
<b>list_position</b> ( $xs, *$ )	$\equiv$	$i$ (if $*$ not found: 0)

## Advanced List Processing (think Haskell, APL)

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```

-- map and fold(l1)
list_transform(xs, x -> e(x))    ≡ [e(x1), ..., e(xn)]
list_reduce(xs, (a, x) -> a ⊗ x) ≡ (...((x1 ⊗ x2) ⊗ x3)...) ⊗ xn
-- apply Boolean mask (bi :: boolean)
list_where(xs, [b1, ..., bn]) ≡ [xi | i ∈ [1, ..., n], bi = true]
-- filter and flatten
list_filter(xs, x -> p(x)) ≡ list_where(xs,
                                         list_transform(xs, x -> p(x))
flatten(xss)                ≡ list_reduce(xss,
                                         (xs1, xs2) -> xs1 || xs2)

```

Also: position-aware map (access list index  $i$  of element  $x$ ):

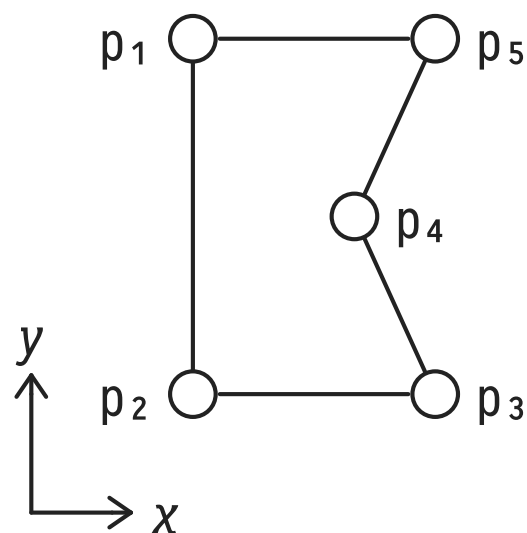
```

list_transform(xs, (x, i) -> e(x, i)) ≡ [e(x1, 1), ..., e(xn, n)]

```

# Farewell, Tables? Use SQL as a List Programming Language?

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	$x$	$y$
	$\downarrow$	$\downarrow$
$p_1$	$=$	$(1,6)$
$p_2$	$=$	$(1,1)$
$p_3$	$=$	$(7,1)$
$p_4$	$=$	$(5,4)$
$p_5$	$=$	$(7,6)$

- Area of the 2D polygon  $p_1 \cdots p_5$  (“shoe lace” formula):

$$\begin{array}{rcccl}
 x & \rightarrow & 1 & 1 & 7 & 5 & 7 & 1 & \\
 & & X & X & X & X & X & & \\
 y & \rightarrow & 6 & 1 & 1 & 4 & 6 & 6 & \\
 & & & & & & & & \vdots
 \end{array}
 \quad \frac{1}{2} \times \left( \begin{array}{l} p_1.x \times p_2.y - p_2.x \times p_1.y \\ + p_2.x \times p_3.y - p_3.x \times p_2.y \\ + \dots \end{array} \right)$$

## 4 : Bridging Lists and Tables: **unnest** & aggregate **list**

```
SELECT t.elem
FROM   unnest( $[x_1, \dots, x_n]$ ) AS t(elem)
```

$\equiv XS$

**Table t**

elem
$x_1$
$\vdots$
$x_n$

```
SELECT list(t.elem) AS xs
FROM   (VALUES ( $x_1$ ),
                $\vdots$ 
               ( $x_n$ )) AS t(elem)
```

xs
$[x_1, \dots, x_n]$

- **unnest(•)**: a *table-returning function*. More on that soon.
- ⚠ Preservation of order of the  $x_i$  is *not* guaranteed...

## Representing Order (Indices) As First-Class Values

```
SELECT t.*
FROM   unnest([x1,...,xn])
      WITH ORDINALITY AS t(elem,idx)
                                ↑
```

recall ordered aggregates

```
SELECT list(t.elem ORDER BY t.idx) AS xs
FROM   (VALUES (x1,1),
              ⋮
              (xn,n)) AS t(elem,idx)
```

≡

elem	idx
x <sub>1</sub>	1
⋮	⋮
x <sub>n</sub>	n

≡

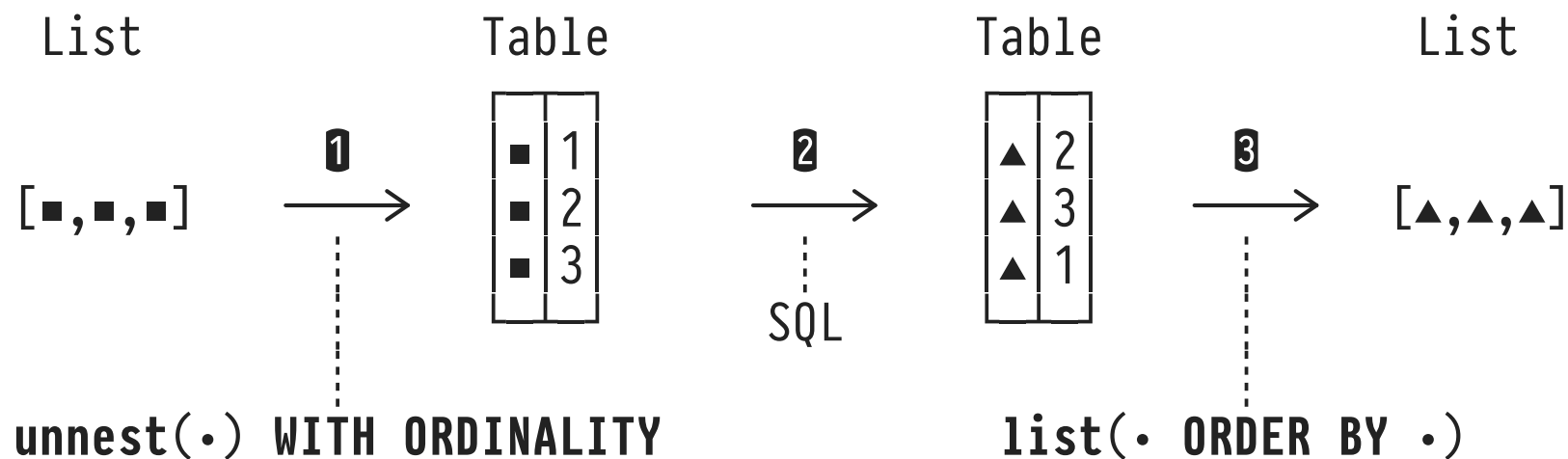
xs
[x <sub>1</sub> ,...,x <sub>n</sub> ]

- *f*(...) WITH ORDINALITY adds a trailing column (see ↑) of ascending indices 1,2,... to the output of function *f*.

## A Relational List Programming Pattern

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Availability of `unnest(·)` and ordered aggregate `list(·)` suggests a pattern for **relational list programming**:



- At ❷ use the full force of SQL, read/transform/generate elements and their positions at will.
- ❶+❸ constitute **overhead**: an RDBMS is *not* a list PL.

## Nested Structs + Lists vs. JSON

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- SQL type constructors `struct(...)` and `τ[]` nest arbitrarily: may build complex tree-shaped structures much like JSON.
- DuckDB supports bidirectional casting between SQL and JSON values:
  - SQL structs ↔ JSON objects, SQL lists ↔ JSON arrays.
  - SQL → JSON ✓ ⚠ Prerequisites for SQL ← JSON casting:
    - JSON object keys needs to be known *a priori*.
    - JSON arrays need to be homogeneous.
- SQL's `unnest(·)/list(·)` processing idiom applies.

## 5 | DuckDB: Key/Value Maps (Type Constructor `map`)

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- Recall the container types:
  - `struct`: map fixed fields to values of varied types.
  - `$\tau$ []`: map dynamic `int` index set to values of type  `$\tau$` .
- Additional container type in DuckDB:
  - `map( $\tau_1, \tau_2$ )`: map dynamic set of keys (of type  `$\tau_1$` ) to values (of type  `$\tau_2$` ).
- **Example:** two equivalent `map(int,boolean)` literals:

```
map {1:true, 3:true, 4:false}
    ≡
map([1,3,4], [true,true,false])
```



## DuckDB: Accessing/Constructing Maps

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Let  $m \equiv \text{map}([k_1, \dots, k_n], [v_1, \dots, v_n])$ ,  $k_i \neq k_j$  for  $i \neq j$ .

```
m[ki]      ≡ [vi]    -- if ki ∈ [k1, ..., kn]
m[ki]      ≡ []       -- otherwise (NB. m[•] cannot fail)
```

```
cardinality(m) ≡ n
map_keys(m)    ≡ [k1, ..., kn]
map_values(m)  ≡ [v1, ..., vn]
```

```
map_entries(m) ≡ {k1:v1, ..., kn:vn}
map_from_entries([{\}:k1, {\}:v1}, ..., {\}:kn, {\}:vn}) ≡ m -- any \
```

```
map_concat(m1, m2)  -- merges maps m1 and m2
                      -- (keys in m2 overwrite those in m1)
```

## 6 : Table-Generating Functions

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What is the **type** of `unnest(·)`?

- `unnest(·)` establishes a bridge between lists and SQL's tabular data model:

$$\text{unnest} :: \tau[] \rightarrow \text{TABLEOF } \tau$$

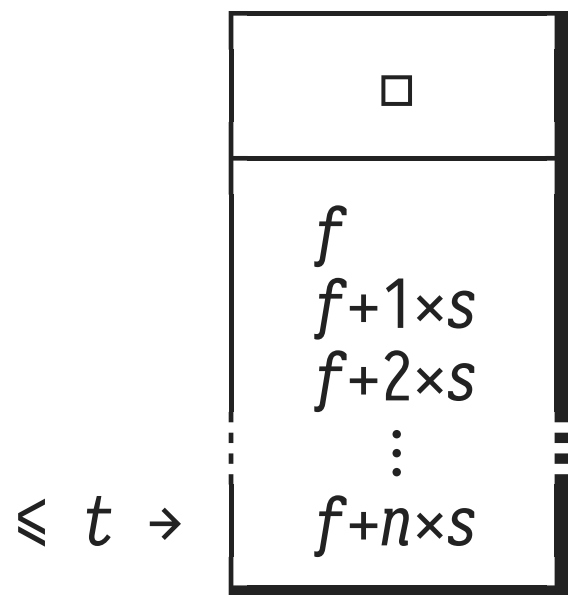
- In SQL, functions of type  $\tau_1 \rightarrow \text{TABLEOF } \tau_2$  are known as **table-generating or set-returning functions**. May be invoked wherever a query expects a table (`FROM` clause): compositionality.
- Several of these functions are built into DuckDB.

## Series Generators

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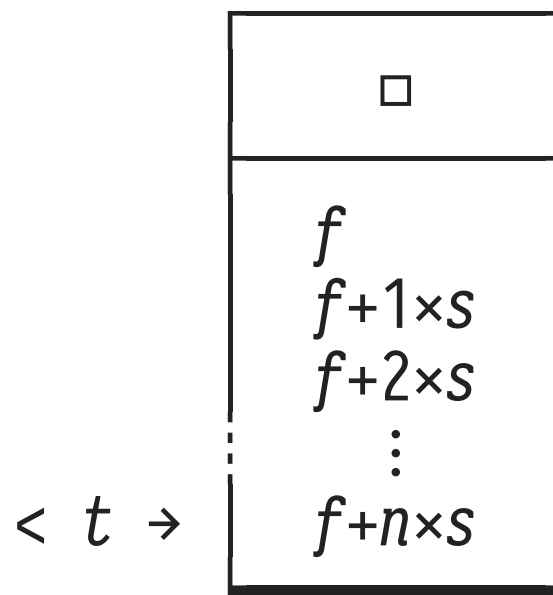
Built-in table-generating functions that generate **tables of consecutive numbers/values**:

**generate\_series( $f, t, s$ )**



$s \equiv 1$ , if absent  
 $f, t$ : numbers/timestamps

**range( $f, t, s$ )**

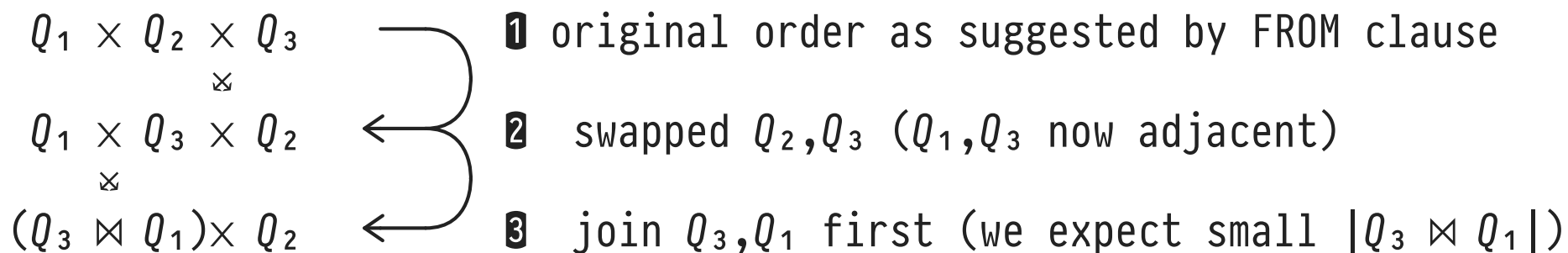


$s \equiv 1$ , if absent  
 stop value  $t$  excluded

## 7 : ', ' in the **FROM** Clause and Row Variable References

```
SELECT ...
FROM   Q1 AS t1, Q2 AS t2, Q3 AS t3 -- ti<j not free in Qj
```

- Q: Why is  $t_{i<j}$  not usable in  $Q_j$ ?
- A: “... the ', ' in **FROM** is commutative and associative...”.  
Query optimization might rearrange the  $Q_j$ :



## But Dependent Iteration in **FROM** is Useful...

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Recall (find largest label in each tree  $t_1$ ):

```

SELECT t1.tree, MAX(t2.label) AS "largest label"
--           Q1                Q2
--           └───┬──────────┘
FROM   Trees AS t1, unnest(t1.labels) AS t2(label)
GROUP BY t1.tree;
           ↑
           ⚡

```

- **Dependent iteration** (here:  $Q_2$  depends on  $t_1$  defined in  $Q_1$ ) has its uses and admits intuitive query formulation.
- **NB.** DuckDB's “friendly SQL” analyzes dependencies between **FROM** clause entries, introduces **LATERAL** automatically.

## LATERAL:<sup>1</sup> Dependent Iteration for Everyone

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Prefix  $Q_j$  with **LATERAL** in the **FROM** clause to announce dependent iteration:

```
SELECT ...
FROM    $Q_1$  AS  $t_1$ , ..., LATERAL  $Q_j$  AS  $t_j$ , ...
                                ↑
                                may refer to  $t_1, \dots, t_{j-1}$ 
```

- Works for *any* table-valued SQL expression  $Q_j$ , subqueries in (...) in particular.
  - Good style: be explicit and use **LATERAL** even on DuckDB.

<sup>1</sup> Lateral /'læt(ə)rəl/ a. [Latin *lateralis*]: *sideways*

## LATERAL: SQL's for each-Loop

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LATERAL admits the formulation of **nested-loops** computation:

```
SELECT e
FROM   Q1 AS t1, LATERAL Q2 AS t2, LATERAL Q3 AS t3
```

is evaluated just like this nested loop:

```
for t1 in Q1
  for t2 in Q2(t1)
    for t3 in Q3(t1, t2)
      return e(t1, t2, t3)
```

- Convenient, intuitive, and perfectly OK.  
But much like hand-cuffs for the query optimizer. ⚠

## LATERAL Example: Find the Top $n$ Rows Among a Peer Group

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Which are **the three tallest** two- and four-legged dinosaurs?

```
SELECT locomotion.legs, tallest.species, tallest.height
FROM   (VALUES (2), (4)) AS locomotion(legs),
       LATERAL (SELECT d.*
                FROM   dinosaurs AS d
                WHERE  d.legs = locomotion.legs ←
                ORDER BY d.height DESC
                LIMIT 3) AS tallest
```

legs	species	height
2	Tyrannosaurus	7
2	Ceratosaurus	4
2	Spinosaurus	2.4
4	Supersaurus	10
4	Brachiosaurus	7.6
4	Diplodocus	3.6



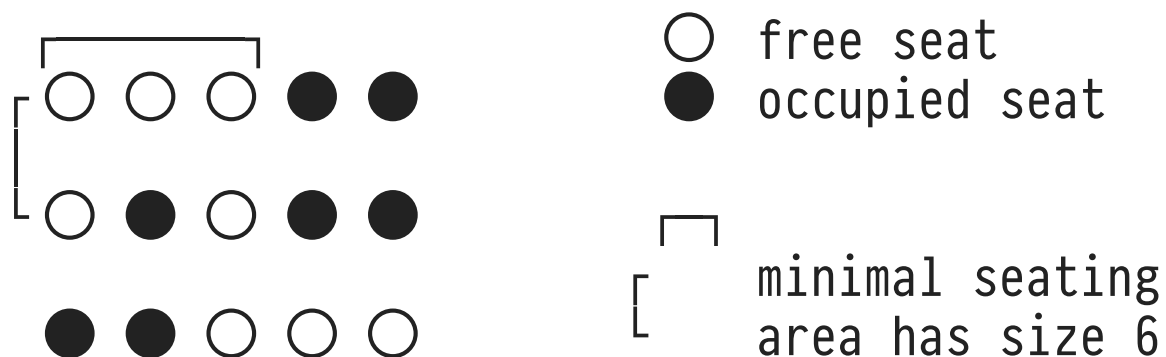
## 8 | ACM ICPC: Finding Seats

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ACM ICPC Task **Finding Seats** (South American Regionals, 2007)

*“ $K$  friends go to the movies but they are late for tickets. To sit close to each other, they look for  $K$  free seats such that the rectangle containing these seats has minimal area.”*

- Assume  $K = 5$ :



## 🔧 Finding Seats: Parse the ICPC Input Format

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- Typical ICPC character-based input format:

...XX <sup>C<sub>R</sub></sup>	•	free seat
.X.XX <sup>C<sub>R</sub></sup>	X	occupied seat
XX...	<sup>C<sub>R</sub></sup>	new line

- **Parse into table** making seat position/status explicit:

<u>row</u>	<u>col</u>	<u>taken?</u>
1	1	false
1	2	false
1	3	false
1	4	true
⋮	⋮	⋮
3	5	false

Table `seats`

## 🔧 Finding Seats: Parse the ICPC Input Format (Table **seats**)

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```
-- Assume cinema ≡ E'...XX\n.X.XX\nXX...'
```

```
SELECT  row.pos, col.pos, col.x = 'X' AS "taken?"
FROM    -- rows
          unnest(string_split(cinema, E'\n'))
          WITH ORDINALITY AS row(xs, pos),
          -- columns
LATERAL unnest(string_split(row.xs, ''))
          WITH ORDINALITY AS col(x, pos)
```

- `string_split(cinema, E'\n')` yields a list of three row strings: `'...XX'`, `'.X.XX'`, `'XX...'`.
- `string_split(row.xs, '')` splits string `row.xs` into a list of individual characters (= seats).

## 🔧 Finding Seats: A Problem Solution (Generate and Test)

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- **Query Plan:**

1. Parse the input into a seating plan table `seats`.
2. **Generate all** possible north-west (`nw`) and south-east (`se`) corners of rectangular seating areas:
  - For each such 「`nw,se`」 rectangle, scan its seats and **test** whether the number of free seats is  $\geq K$ .
  - If so, record `nw` together with the rectangle's `width/height`.
3. Among these rectangles with sufficient seating space, select one with minimal area.

## 🔧 Finding Seats: Generating All Possible Rectangles

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Generate all 「*nw,se*」 corners for rectangles in the seating plan (table *seats*):

```
SELECT nw, se
FROM   seats AS nw,      -- self-join
       seats AS se
WHERE  nw.col <= se.col  -- 「nw is to the top left of se」
AND    nw.row <= se.row
```

- This generates  $\left( \sum_{r=1}^{\text{rows}} r \right) \times \left( \sum_{c=1}^{\text{cols}} c \right)$  rectangles.
- Generally: If possible, test/filter early.