



How to bring advanced analytics to hybrid data storage with Vertica

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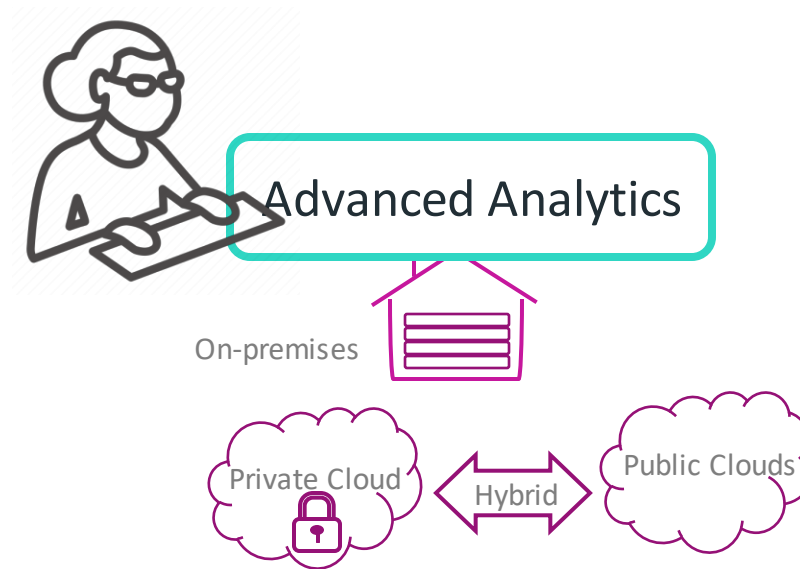
Gianluigi Vigano'

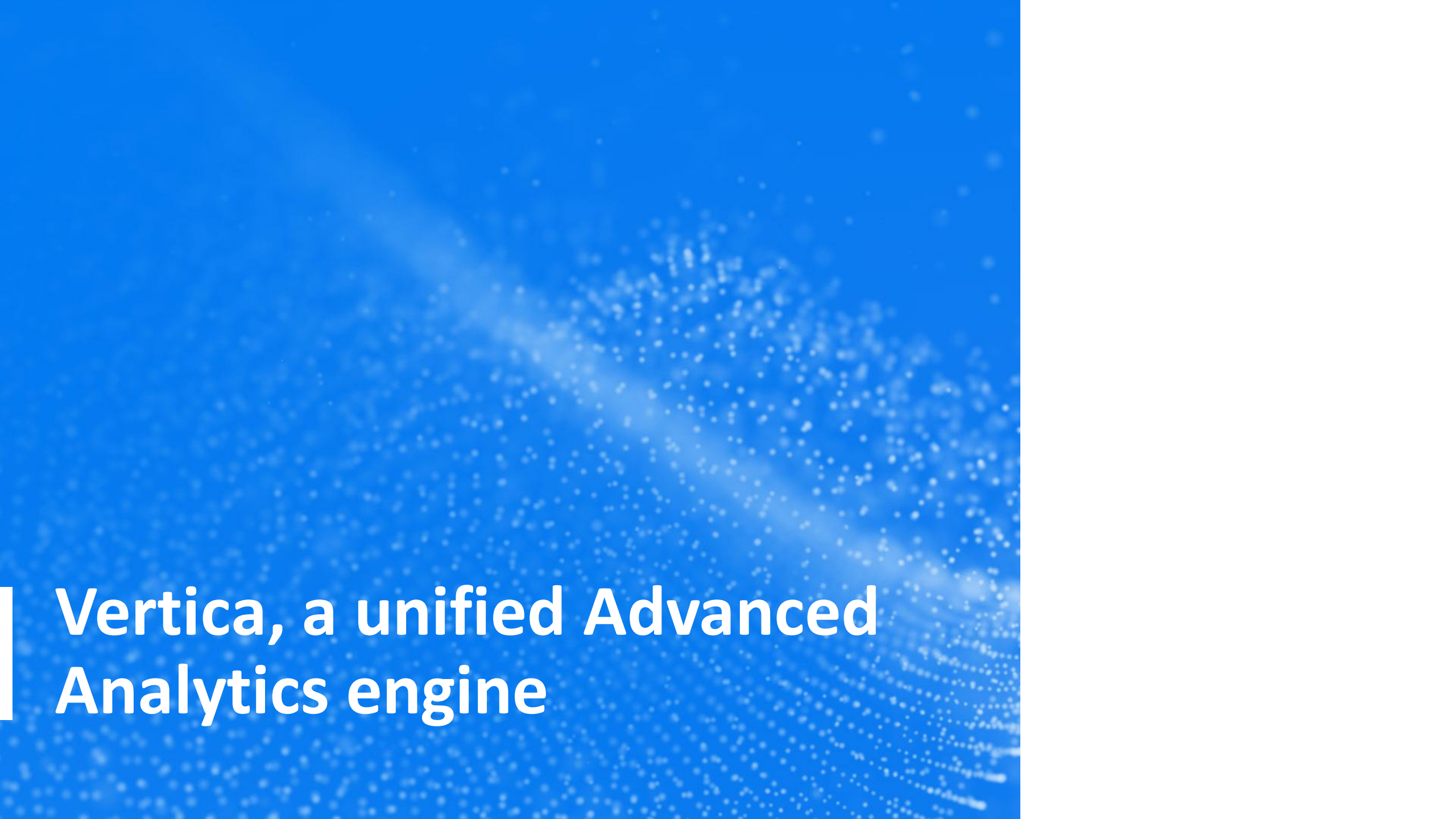
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Advanced Analytics in the hybrid/distributed Age



The background of the slide is a solid blue color. Overlaid on this background are numerous white, glowing particle trails that originate from the bottom right and fan out towards the top left, creating a sense of motion and data flow.

**Vertica, a unified Advanced
Analytics engine**

What is Vertica?

Vertica is the first database built completely **columnar**.

It is an **MPP** query engine with advanced analytics and machine learning.

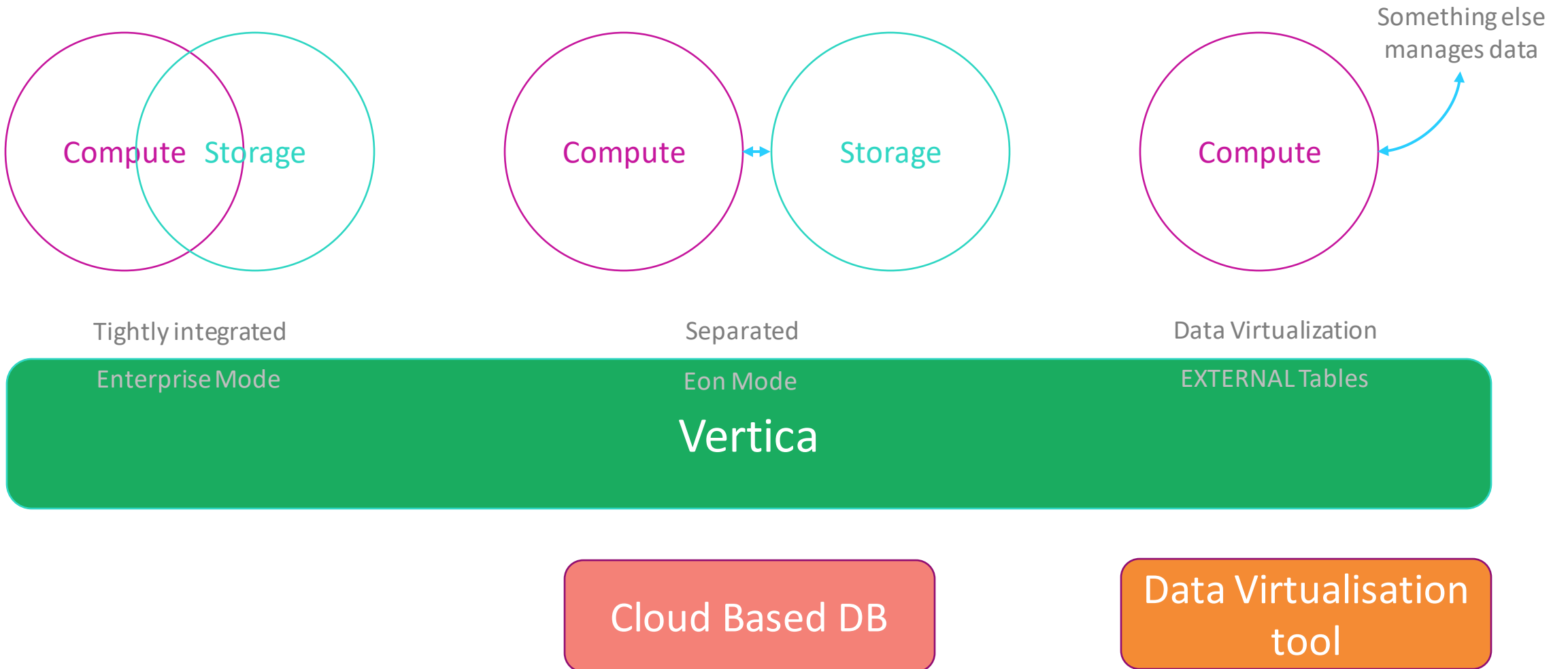


Load and store
data in a data warehouse
designed for **blazing**
fast analytics

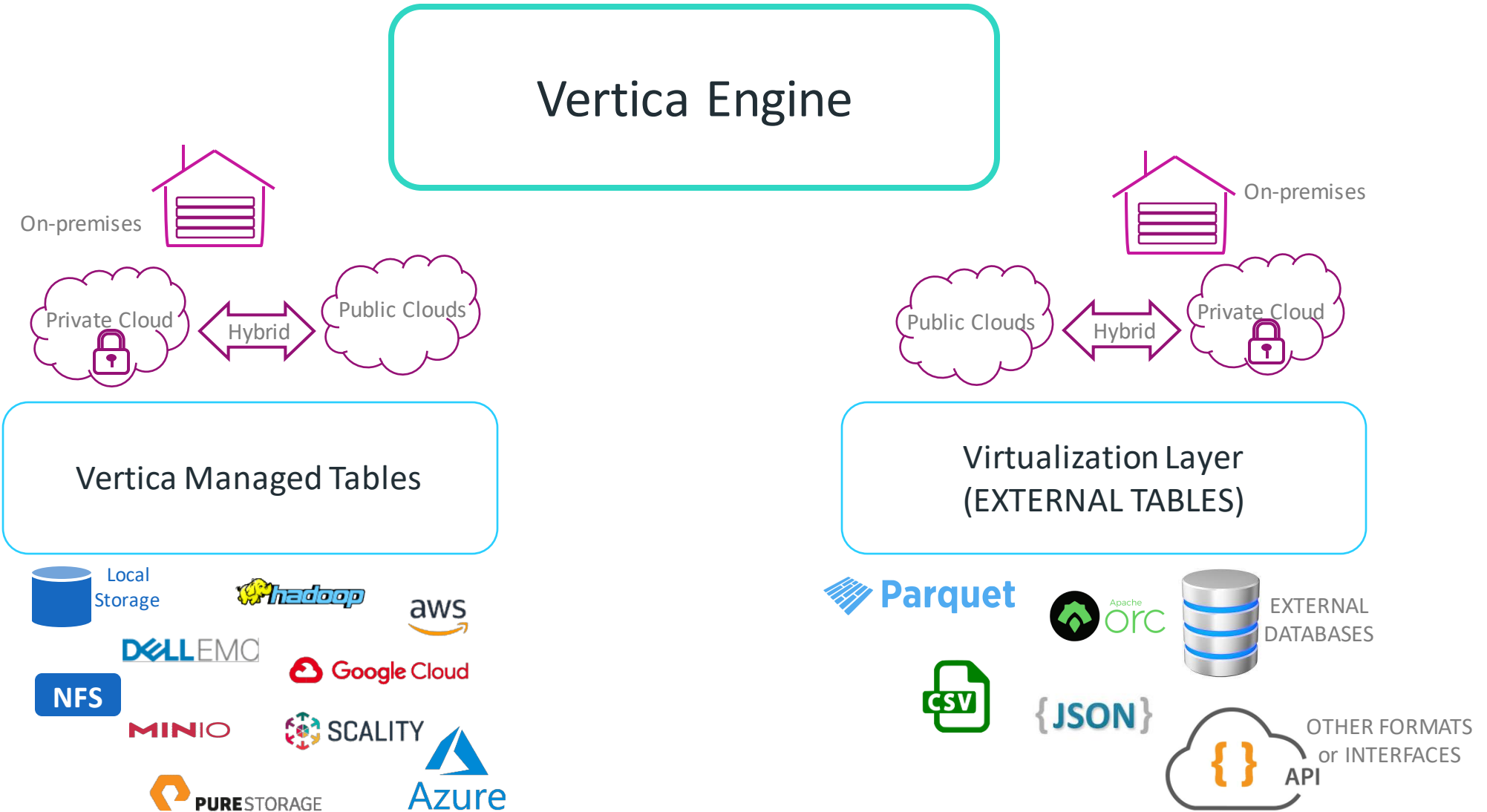
Create, train, and deploy
advanced analytics and
machine learning models
at massive scale

Ask complex analytical
questions and get **fast**
answers, regardless of
where the data resides

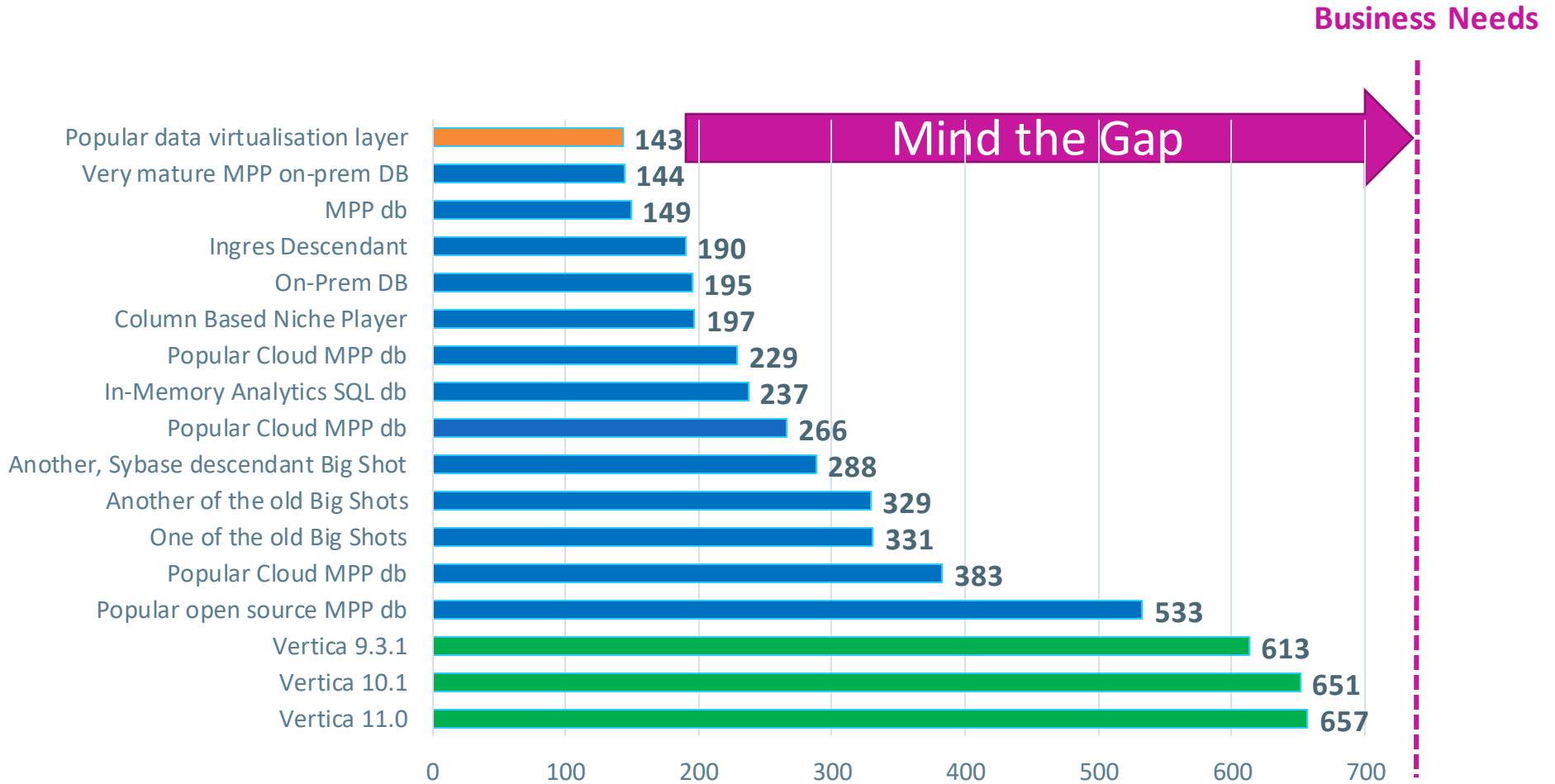
Compute, Storage and Big Data



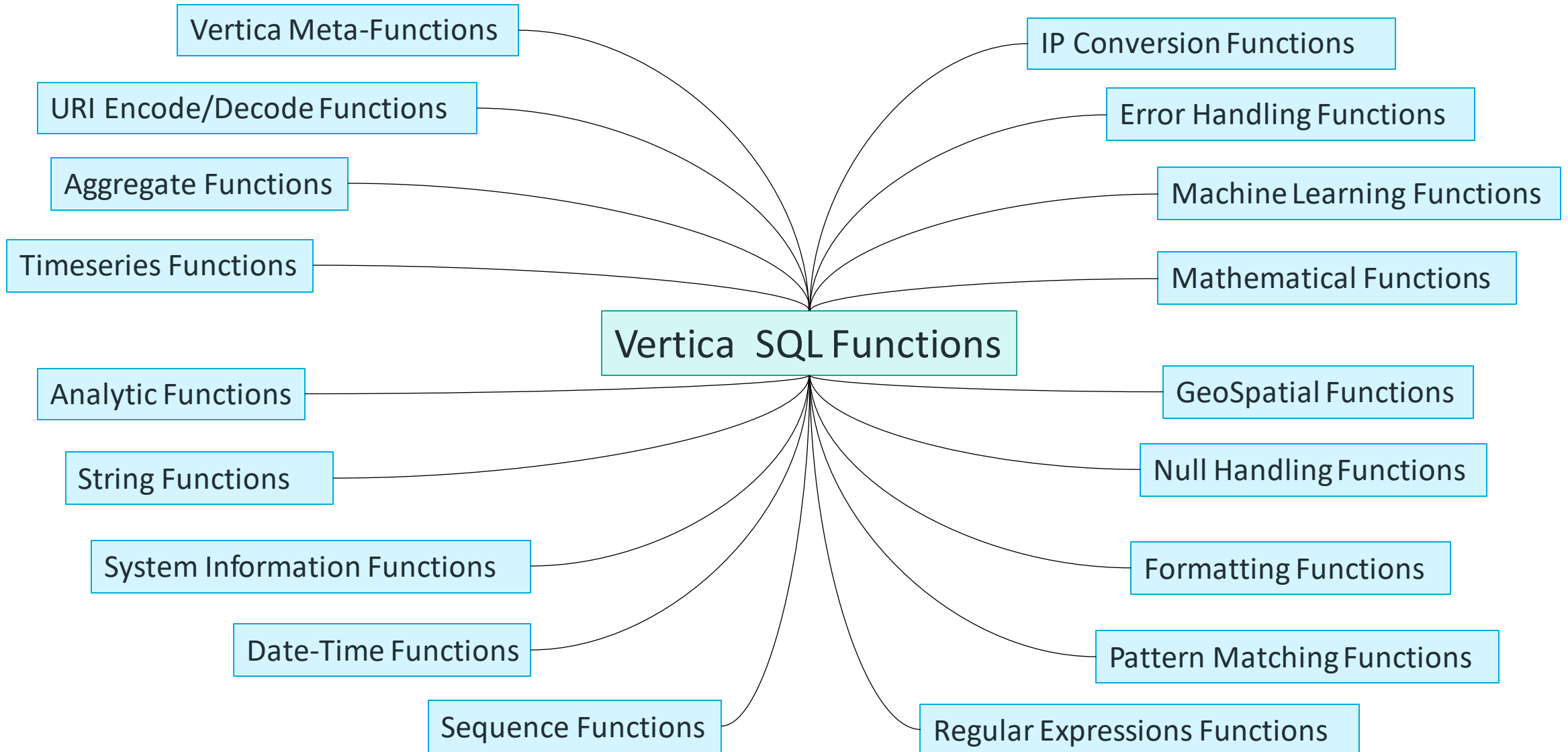
Vertica Engine



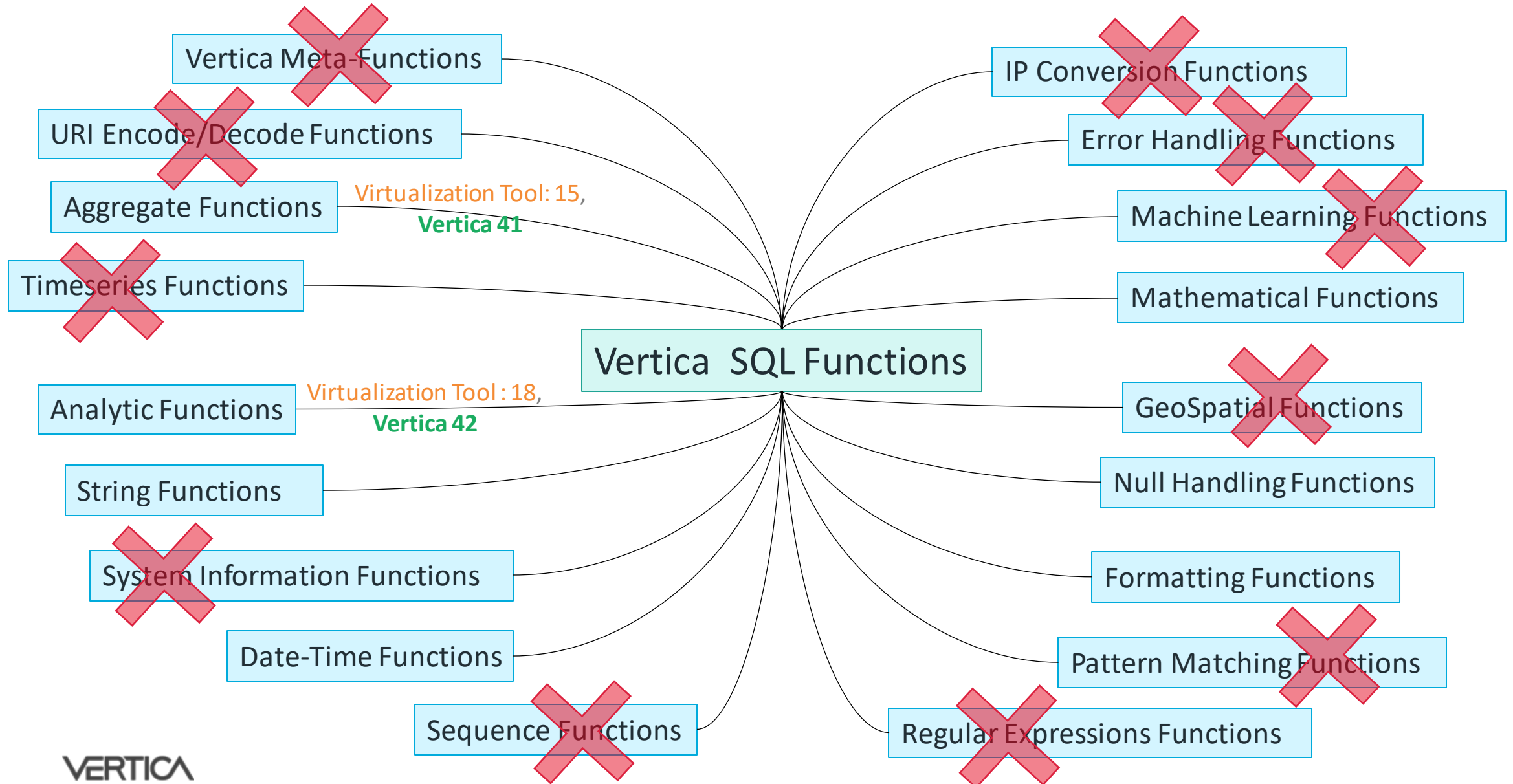
A Huge Set of Built-In Functions



Vertica Functions Overview



Other Data Virtualization tools



Vertica Virtualization Layer – External Table

Vertica External Table

Map any data format

... everywhere

as if it were a normal
Table !

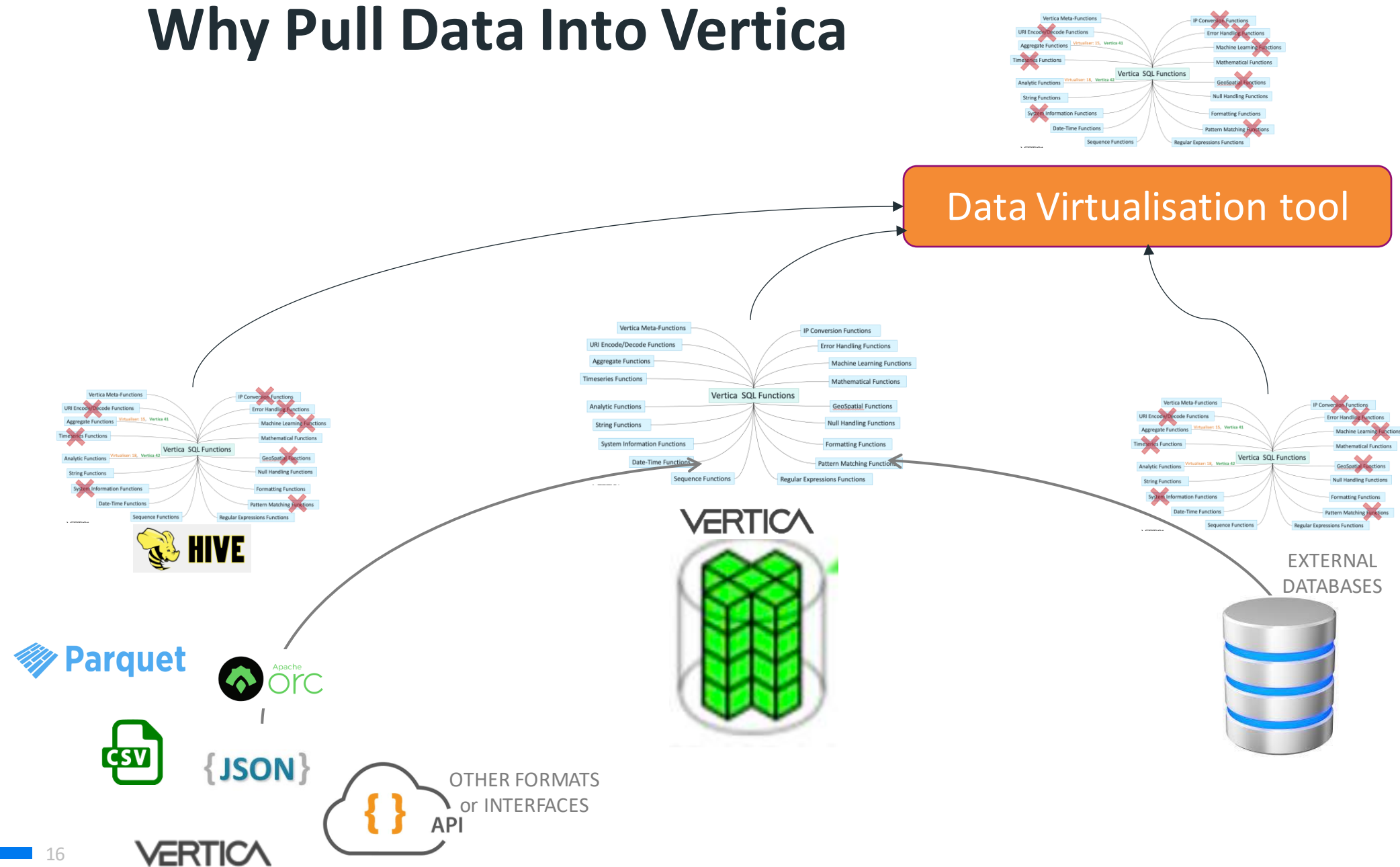
```
CREATE EXTERNAL TABLE public.epeople(  
  id INTEGER,  
  name VARCHAR  
) AS COPY  
  FROM '/data/epeople/*//*.parquet'  
  PARQUET  
  ;
```

When to Use External Tables

Input	Scan Processing / Reducing Unit	Output / Further Processing (Advanced Analytics / ML)	Method
Internal	Internal	Internal Vertica Engine	Vertica Table
Internal and External Source	Internal and External (Join filter / SIPS to Source) Table - > Other DBMS's Optimizer	Internal Vertica Engine	External Table: Federated Query
External Source	WHERE Filter in External Qry Table -> Other DBMS's Optimizer	Internal Vertica Engine	External Table: Federated Query
External Source	None or External (Part. Pruning, etc.) - <i>Except Flat Files</i>	Internal Vertica Engine	External Table: Other

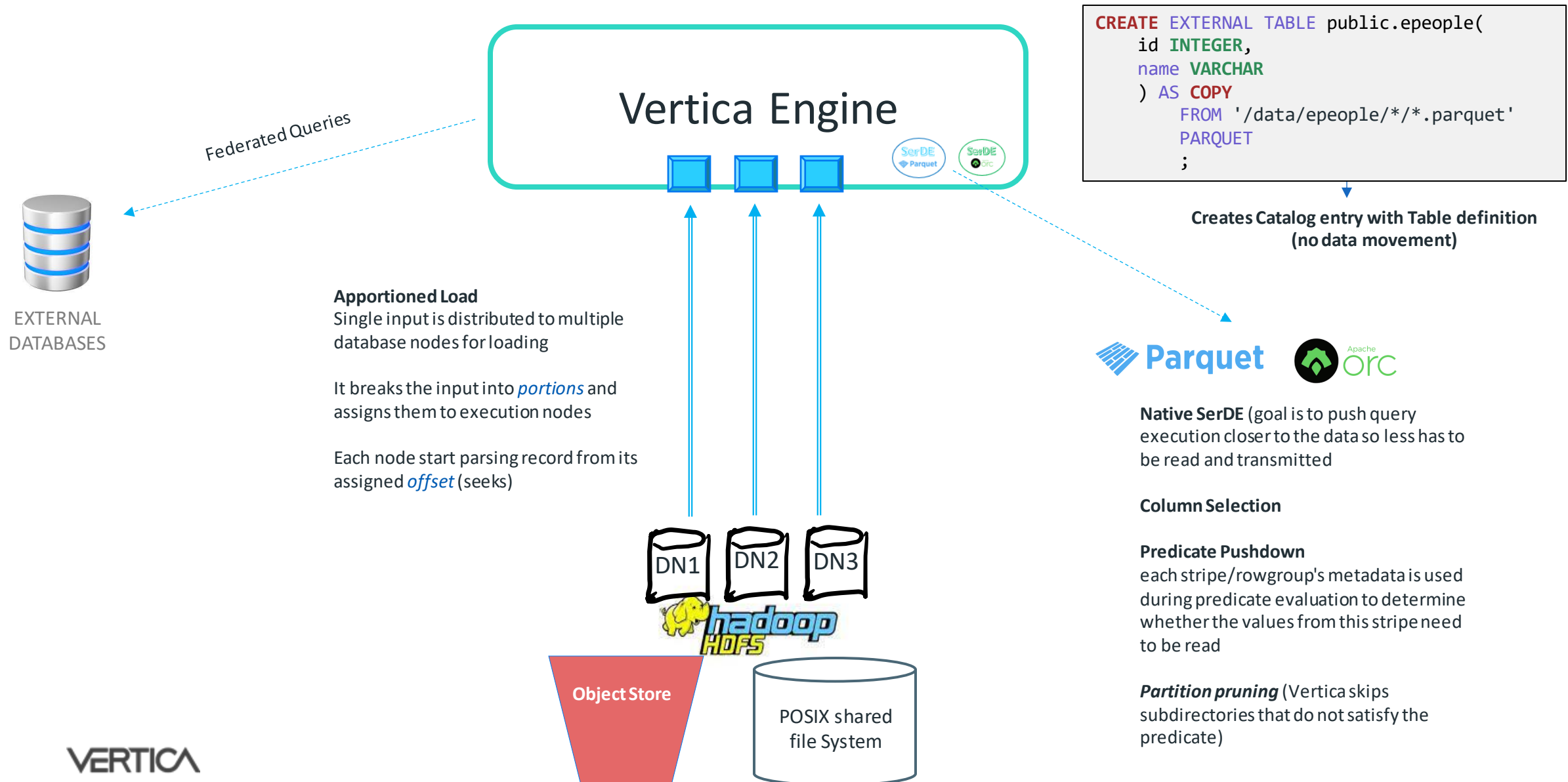
Extrenal Table Types	Parser/Source	Efficient Method
Flat File based	Default CSV & Flex Parsers. No Filter	Make internal ; Create Table and COPY
Parquet / Orc	Parquet/ORC source, via PARQUET/ORG keyword	Exploit filtering mechanisms & keep external
Federated Query Source	ODBC Source & ODBC Parser	Exploit the filter and column pruning pushdown mechanisms & keep external

Why Pull Data Into Vertica



External Table & Complex Data Types

What happens when we query External Table



How to create external table

```
CREATE EXTERNAL TABLE
```

Define table COLUMNS as you would for a native table

```
public.epeople(  
  id INTEGER,  
  name VARCHAR ..
```

add FROM with external data location

```
FROM '/data/eppeople/*/*.parquet'  
  
FROM 'S3://bucket/eppeople..  
  
FROM 'gs .. .
```

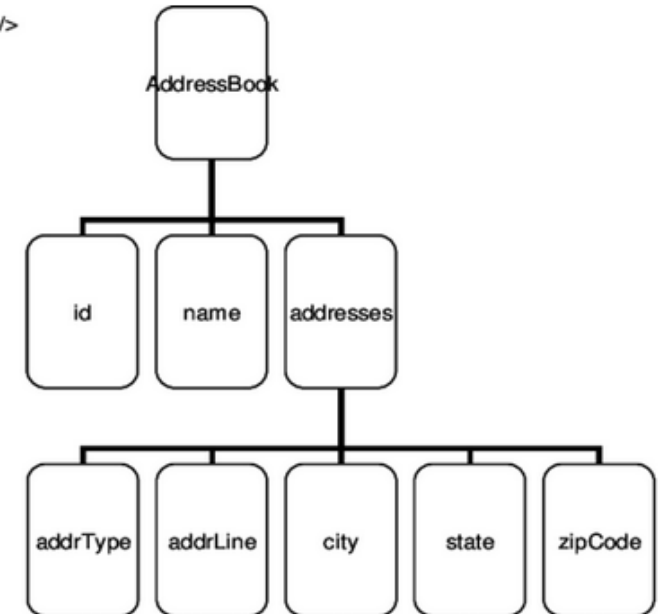
And type (ORC, Parquet.. JSON...)

```
PARQUET  
;
```



How to describe columns for table with long structure and may be complex data type

```
<element name="AddressBook" type="tns:AddressBookType"/>  
<complexType name="AddressBookType">  
  <all>  
    <element name="id" type="double"/>  
    <element name="name" type="string"/>  
    <element name="addresses">  
      <complexType>  
        <all>  
          <element name="address" type="tns:Address"  
            minOccurs="0" maxOccurs="unbounded"/>  
        </all>  
      </complexType>  
    </element>  
  </all>  
</complexType>  
<complexType name="Address">  
  <all>  
    <element name="addrType" type="double"/>  
    <element name="addressLine" type="string"/>  
    <element name="city" type="string"/>  
    <element name="state" type="string"/>  
    <element name="zipCode" type="string"/>  
  </all>  
</complexType>
```



Automatically read external structure



INFER_EXTERNAL_TABLE_DDL

- Inspect a file in Parquet or ORC format and return the “CREATE” statement
- Fully define complex types, included nested types
- Eventually treat the column as LONG VARBINARY value
- Partition column = UNKNOWN data type
 - (Parquet/ORC contain insufficient info to define it)

Others:

- csv, delimited ... [d2le](https://github.com/marco-the-sane/d2le) (<https://github.com/marco-the-sane/d2le>)
- JSON, CEF, AVRO ... use built in parser

```
=> SELECT INFER_EXTERNAL_TABLE_DDL('/data/people/*.parquet'  
    USING PARAMETERS format = 'parquet', table_name = 'employees');
```

INFER_EXTERNAL_TABLE_DDL

```
create external table "employees"(  
  "employeeID" int,  
  "personal" Row(  
    "name" varchar,  
    "address" Row(  
      "street" varchar,  
      "city" UNKNOWN,  
      "zipcode" int  
    ),  
    "taxID" int  
  ),  
  "department" varchar  
) as copy from '/data/people/*/*.parquet' parquet;  
(1 row)
```

Diagram annotations:

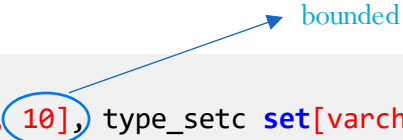
- Arrows point from "Row" and "Row" in the schema to the text "same as struct".
- An arrow points from "UNKNOWN" in the schema to the text "partitioning".
- An arrow points from "/*/*.parquet" in the file path to the text "partitioning".

```
WITH parser fjsonparser
```

Complex Data Type in Vertica native table

- New Complex Data Types introduced
 - **(ROW), ARRAY, SET**
 - **ARRAY** is a 1D unordered collection of elements, including duplicates (as-is as from the input)
 - **SET** is a 1D ordered and de-duplicated collection of elements. Implemented to optimize element look-up
 - when **ARRAY::SET**, Vertica sorts the values and removes duplicate elements, it can improve query checking for element presence

```
create table complex (id int,  
                      type_arrayc array[varchar, 10], type_setc set[varchar, 10] default type_arrayc::SET[varchar],  
                      type_arrayi array[int, 10], type_seti set[int, 10] default type_arrayi::SET[int]  
                      );
```



```
insert into complex (type_arrayc, type_arrayi) values (ARRAY['a','b','b','d','c'], ARRAY[1,2,2,-1,5,5,3,0]);
```

```
select * from complex;
```

id	type_arrayc	type_setc	type_arrayi	type_seti
	["a","b","b","d","c"]	["a","b","c","d"]	[1,2,2,-1,5,5,3,0]	[-1,0,1,2,3,5]

Why bounded Array ?

- Arrays and SET can be:
 - bounded, meaning they specify a maximum element count
 - or unbounded (have a maximum binary size)
 - Set explicitly
 - or defaulted
- BOUNDED Array/SET helps resource manager to execute efficiently because the bounds are known

```
dbadmin=> create table public.test1 ( a1 ARRAY[INT], a2 ARRAY[INT,200], a3 ARRAY[INT] (20000) );  
CREATE TABLE
```

```
dbadmin=> \d public.test1;
```

List of Fields by Tables

Schema	Table	Column	Type	Size	Default	Not Null	Primary Key	Foreign Key
public	test1	a1	array[int8] (65000)	65000		f	f	
public	test1	a2	array[int8, 200]	1600		f	f	
public	test1	a3	array[int8] (20000)	20000		f	f	

(3 rows)

Default tunable

Vertica and ... the Others

Feature	Vertica	Popular Cloud Solution	Popular SaaS Offering	Spark
SET Type	Yes	Yes	No	No
Full Support for Null/Empty Arrays	Yes	No	Yes	No
Bounded Arrays	Yes	No	No	No

VARCHAR vs Complex Data Types

- Customer has **Wide** (>1000 columns), **Big** (>160 Billion rows), **Flat** table containing **lists** of integer like in a text field: “13426,6732664,9892836,...” (hundreds of integers)
- Queries on this **WBF** table...
 - Always have a filter on date (`WHERE dt BETWEEN '20201101' AND '20210331'`)
 - Always have filters on list of integers text (`AND INSTR(vc, '994992') > 0`)
- Scope of this test is to check how to optimize the table structure in order to optimize query elapsed

Test Environment

- Initial Table structure (public.at1):

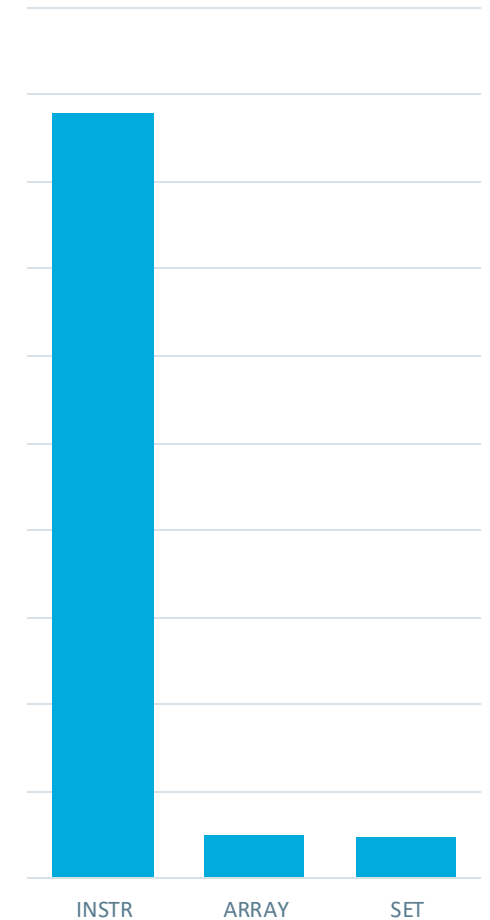
```
CREATE TABLE public.at1 (  
  id INTEGER NOT NULL ,  
  vc VARCHAR(4096) NOT NULL ,  
  ar ARRAY[INT, 300] DEFAULT string_to_array('['||vc||']', ',')::ARRAY[INT] ,  
  se SET[INT, 300] DEFAULT string_to_array('['||vc||']', ',')::ARRAY[INT]::SET[INT]  
)  
ORDER BY id  
SEGMENTED BY HASH(id)  
ALL NODES KSAFE;
```

- Has been loaded with 100ML rows generated this way:

```
$ nohup perl -e 'do{print $n++, "|", map{int(rand(2000000))-1000000, ","}1..int(rand(300));  
print int(rand(2000000))-1000000, "\n"} foreach 1..100000000' | vsql -AXntq -c "COPY  
public.at1(id, vc) FROM STDIN DELIMITER '|' ABORT ON ERROR STREAM NAME 'INSTR_TEST'"
```

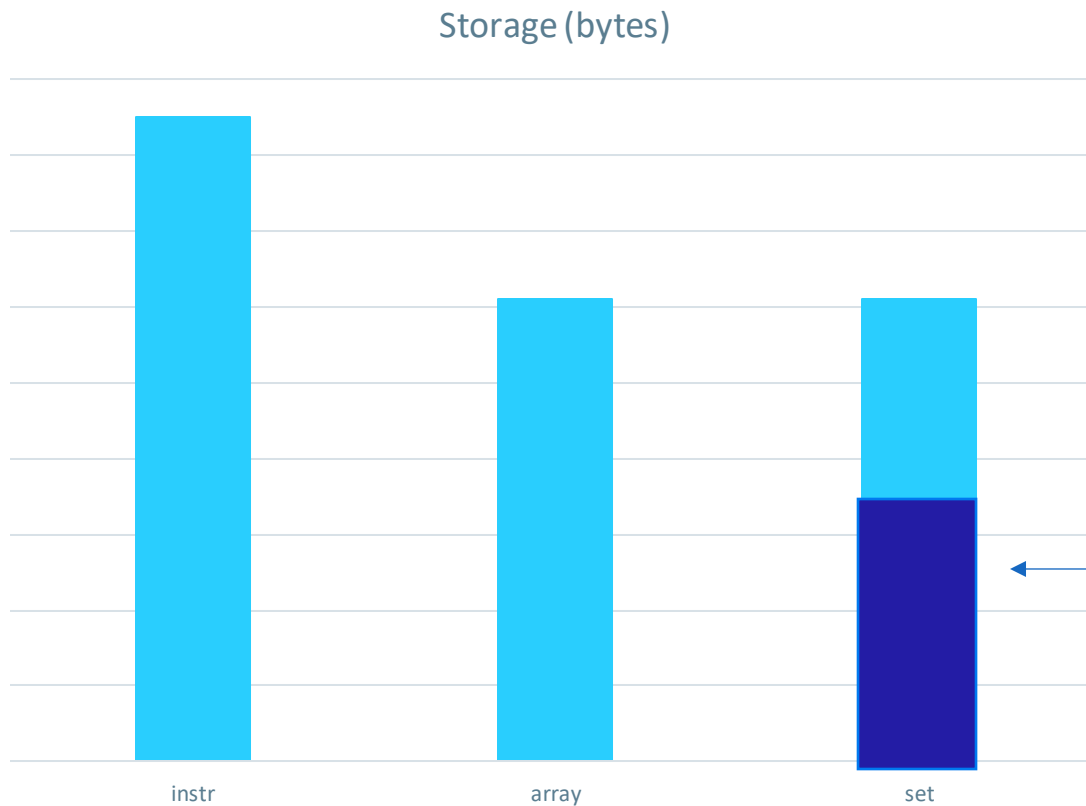
INSTR vs ARRAY vs SET – Query Performance

```
-- PERFORMANCE TEST (STRING SEARCH):  
SELECT COUNT(*) FROM ( SELECT id FROM public.at1 WHERE INSTR(vc, '994992') > 0 ) x;  
-- out  COUNT  
-- out  -----  
-- out  15177  
-- out  (1 row)  
  
-- PERFORMANCE TEST (ARRAY SEARCH):  
SELECT COUNT(*) FROM ( SELECT id FROM public.at1 WHERE CONTAINS(ar, 994992)  
                        OR CONTAINS(ar, -994992) ) x;  
-- out  COUNT  
-- out  -----  
-- out  15177  
-- out  (1 row)  
  
-- PERFORMANCE TEST (SET SEARCH - MULTIPLE VALUES):  
SELECT COUNT(*) FROM ( SELECT id FROM public.at1 WHERE CONTAINS(se, 994992)  
                        OR CONTAINS(se, -994992) ) x;  
-- out  COUNT  
-- out  -----  
-- out  15177  
-- out  (1 row)
```



ARRAY/SET $\approx$ 18 times
faster than INSTR

Storage Requirements



- ARRAY/SET need 29% less storage resources than VARCHAR
- SET needs 1% less storage than ARRAY
 - (Influenced by redundancies)
 - Random generated values
 - If the collection has 300 random elements

Flattening vs. Complex Data Types

- We construct a micro-benchmark to evaluate flattening the data vs. using a complex data type
- The micro-benchmark consists of user ids and corresponding search words searched by the user
 - The data set consists of 1,000,000 users each with up to 1000 distinct search words
- The table schemas used are below

```
CREATE TABLE words_flat (userName VARCHAR, words VARCHAR) ;
```

```
CREATE TABLE words_array (userName VARCHAR, words ARRAY[VARCHAR, 1000]) ;
```

```
CREATE TABLE words_set (userName VARCHAR, words SET[VARCHAR, 1000]) ;
```

Flattening vs. Complex Data Types

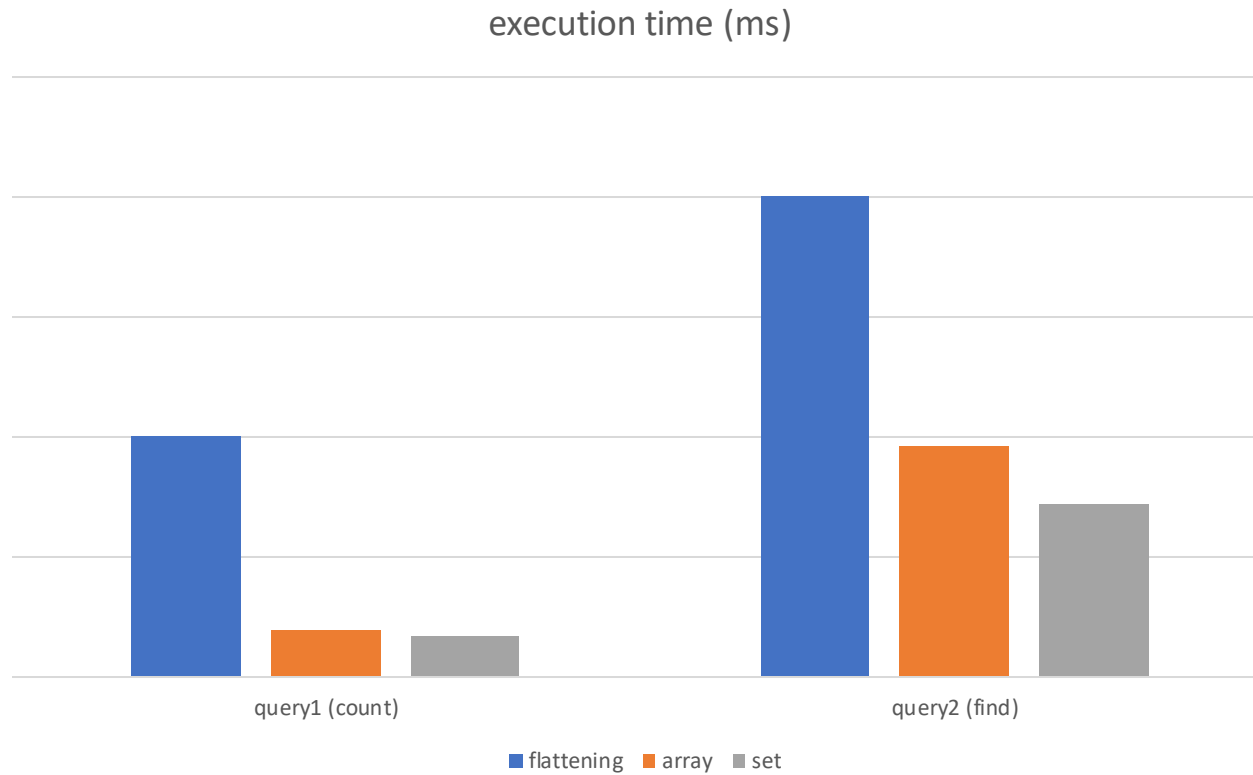
- The queries used:
 - Query 1: Count the number of search words used by each user:

```
SELECT userName, count(words) FROM words_flat GROUP BY userName;  
SELECT userName, apply_count(words) FROM words_array;  
SELECT userName, apply_count(words) FROM words_set;
```

- Query 2: Find users that used a specific search word

```
SELECT userName FROM words_flat WHERE words = 'XBox';  
SELECT userName FROM words_array WHERE contains(words, 'XBox');  
SELECT userName FROM words_set WHERE contains(words, 'XBox');
```

Execution time

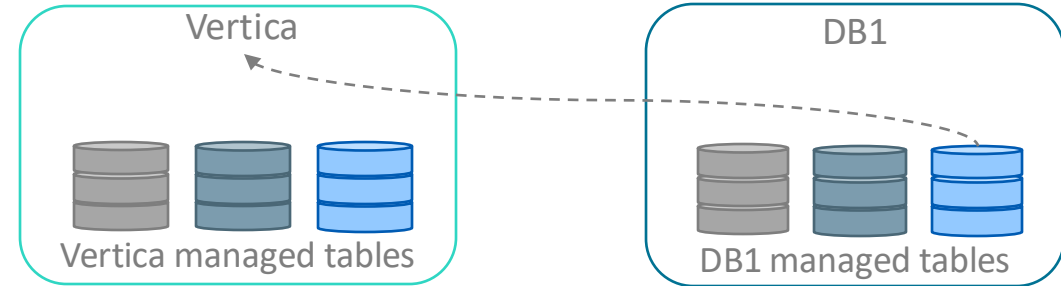


- In COUNT(*):
 - ARRAY approach is 5+ times faster
 - SET is 6+ times faster
- In find:
 - ARRAY is 2+ times faster than flattening approach
 - SET is ≈ 3 times faster

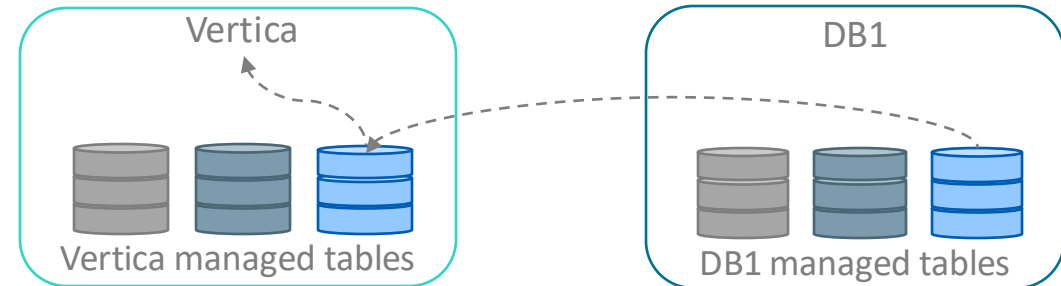
Vertica Federated Queries

Vertica Federated Queries - Scope

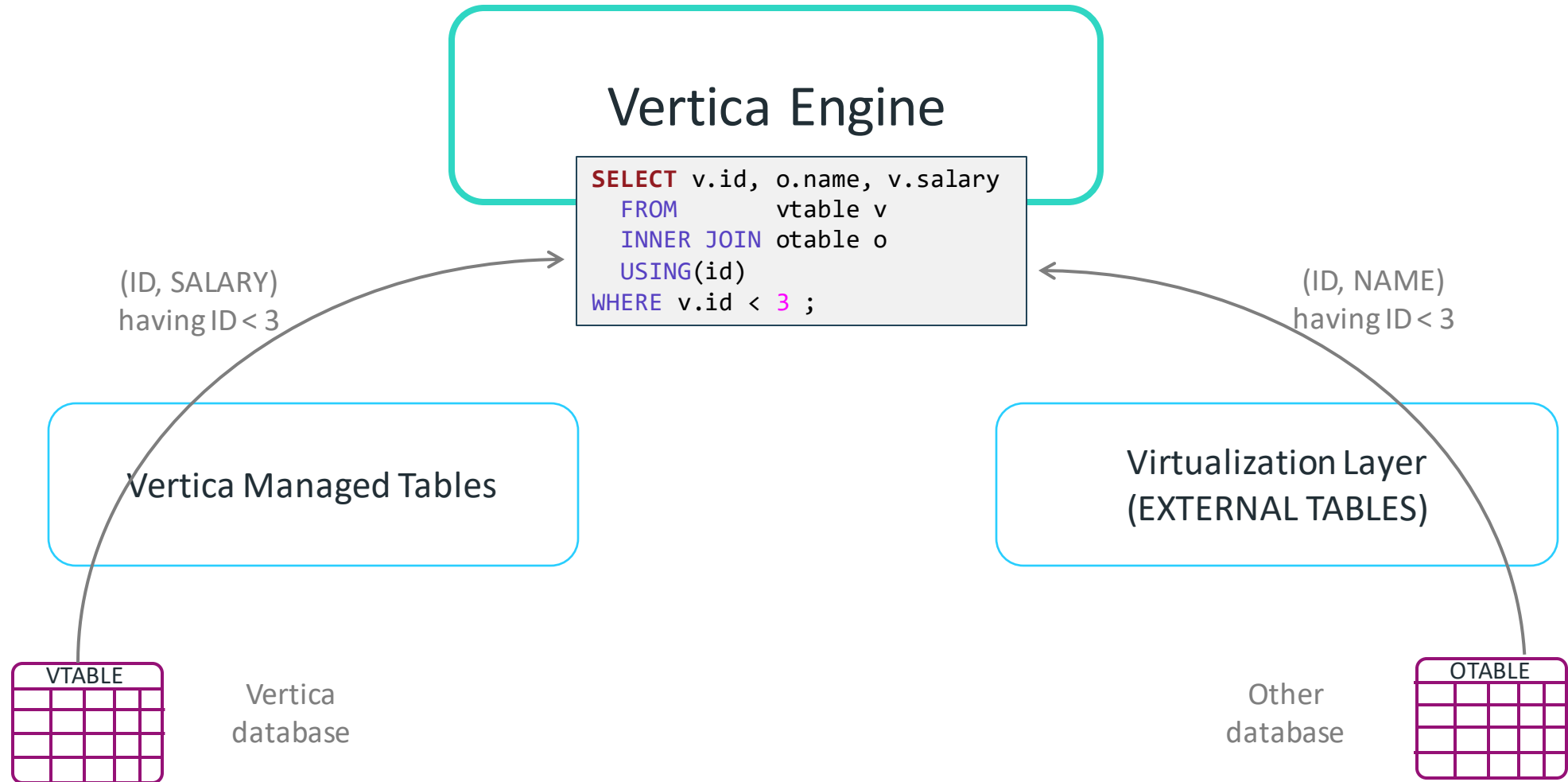
- Run queries against other databases



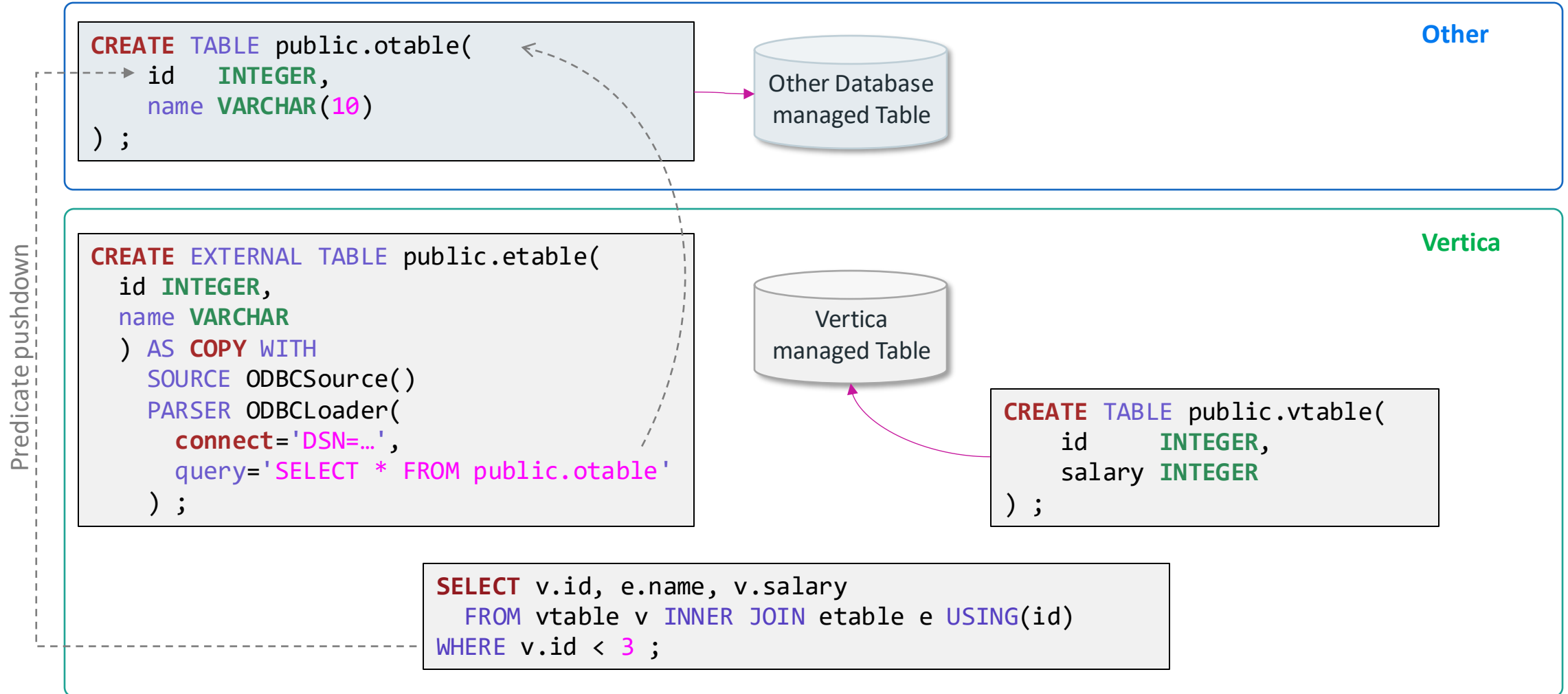
- Join Vertica and non-Vertica managed tables



Example

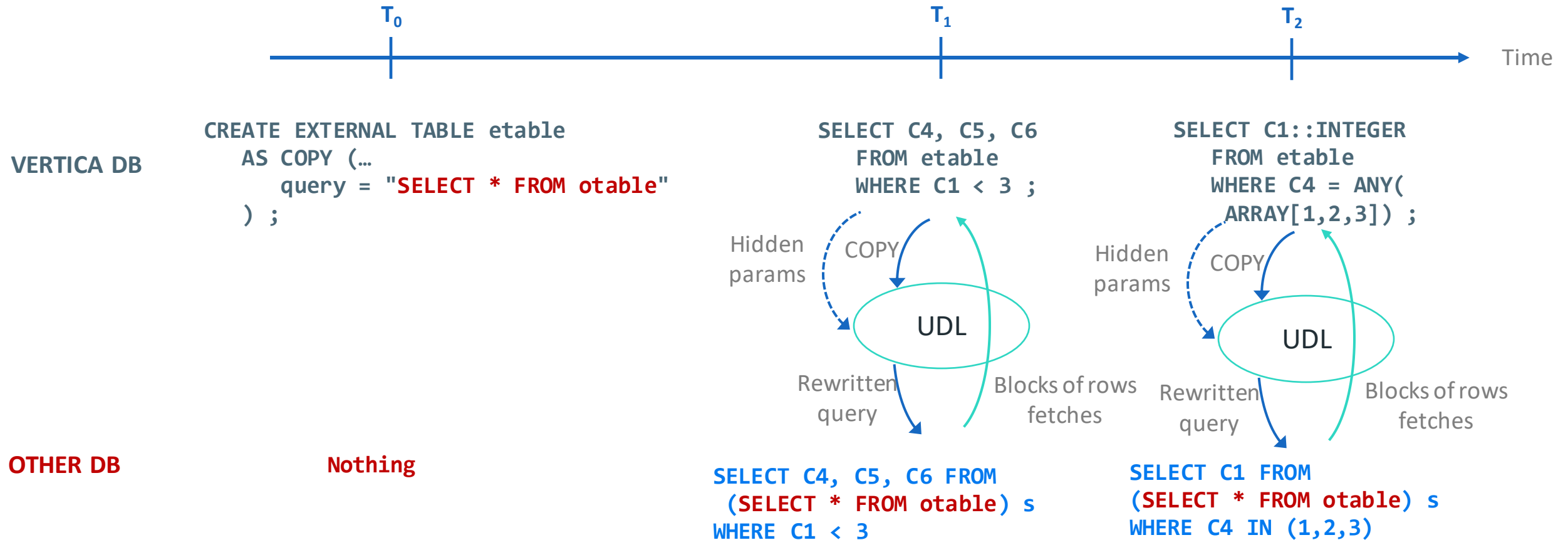


How it works...



https://github.com/vertica/Vertica-Extension-Packages/tree/master/odbc_loader_package

Vertica Federated Queries and the time axis



[illegible]

Query conversion examples

```
CREATE TABLE public.mypeople(  
  id          INTEGER ,  
  salary      NUMERIC(8,2)  
;  
;
```

```
CREATE EXTERNAL TABLE public.ext_mypeople(  
  id          INTEGER ,  
  name        VARCHAR(10),  
  gender      CHAR(1),  
  bdate       DATE  
) AS COPY WITH SOURCE ODBCSource() PARSER ODBCLoader(  
  connect='DSN=mmf', query='SELECT * FROM mmf.mypeople' ) ;
```

Query in Vertica	Query against the other database
SELECT COUNT(*) FROM ext_mypeople	SELECT id, NULL, NULL, NULL FROM (SELECT * FROM mmf.mypeople) sq
SELECT COUNT(*) FROM ext_mypeople WHERE gender = 'F'	SELECT NULL, NULL, gender, NULL FROM (SELECT * FROM mmf.mypeople) sq WHERE (gender = 'F')
SELECT v.id, m.name, v.salary FROM mypeople v INNER JOIN ext_mypeople m USING(id) WHERE v.id > 3	SELECT id, name, NULL, NULL FROM (SELECT * FROM mmf.mypeople) sq WHERE (id > 3)

Other implemented features...

- The loader UDL converts some Vertica-specific syntax:
 - "~" will be translated to `LIKE`,
 - "`ANY(ARRAY[1,2,3])`" will become `IN(1,2,3)`
 - `::<data type>` CAST removed from select list
- Configure the "rowset" (`default 100`) to define number of rows fetched for each `SQLFetch()` iteration
- Possibility to *override* original query at run-time using SESSION PARAMETERS

```
ALTER SESSION SET UDPARAMETER FOR ODBCLoaderLib override_query = '<new query here>';
```

- Possibility to switch on/off rows and/or columns filtering via SESSION PARAMETERS

```
ALTER SESSION SET UDPARAMETER FOR ODBCLoaderLib src_cfilter = false ;
```

```
ALTER SESSION SET UDPARAMETER FOR ODBCLoaderLib src_rfilter = false ;
```

The others... (Popular Cloud-only Database #1)

- Step 1: Run the query in the external database
- Step 2: Export the result set to S3
- Step 3: run the query in “Popular Cloud-only Database 1) reading from S3
- In Vertica we never land a single byte to disk...

The others... (Popular Cloud-only Database #2)

- "Federated Queries" against MySQL & PostgreSQL instances in Cloud SQL
- Very involuted approach
- Data Type mapping at query run time

```
SELECT c.customer_id, c.name, SUM(t.amount) AS total_revenue,  
       rq.first_order_date  
FROM customers AS c  
INNER JOIN transaction_fact AS t ON c.customer_id = t.customer_id  
LEFT OUTER JOIN EXTERNAL_QUERY(  
    'connection_id',  
    '''SELECT customer_id, MIN(order_date) AS first_order_date  
    FROM orders  
    GROUP BY customer_id''' ) AS rq ON rq.customer_id = c.customer_id  
GROUP BY c.customer_id, c.name, rq.first_order_date;
```

The others... (more primitive solutions)

- Some others pretend you to create “EXTERNAL” tables with matching column names
- No predicate push-down
- Data Type mapping at query run time

Conclusions

- Vertica was already able to access data in different storage locations and formats
- We are now able access data managed by other databases in a much more efficient way
- Remember... query are executed IN Vertica
- Vertica has complex native data type
- Numbers are **very good** and customers are very happy:

... works like a charm, WOW...

...This is an incredible feature that doesn't exist for any competing DB platform that once again shows Vertica's advantage...



Thank you

Vertica Community Edition + Docker

www.vertica.com/trial

<https://hub.docker.com/r/verticadocker/vertica-ce>

- Deploy Vertica on up to 3 nodes
- Store up to 1TB of structured and semi-structured data
- Use Vertica with no time limits or license requirements