

# Analytics at scale with Power BI and Azure Synapse





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# Agenda

- Challenges
  - Data Platform
  - Power BI
- Deep Dive
  - Data Platform
  - Power BI
- Hybrid Tables & Incremental Refresh
- Refresh Challenges & Orchestration
- Scaling

# After this session

## Design and implement

Better design and implement complex data models, including hybrid tables, aggregations, and combined storage modes (import, DirectQuery , dual).

## Orchestrate

Orchestrate the end-to-end data processing, with a pipeline chain from data ingest in the data lake house to the incremental Power BI dataset refresh.

## Performance

Use different techniques to identify performance bottlenecks in your solutions and how to solve those ("does it fold"?).

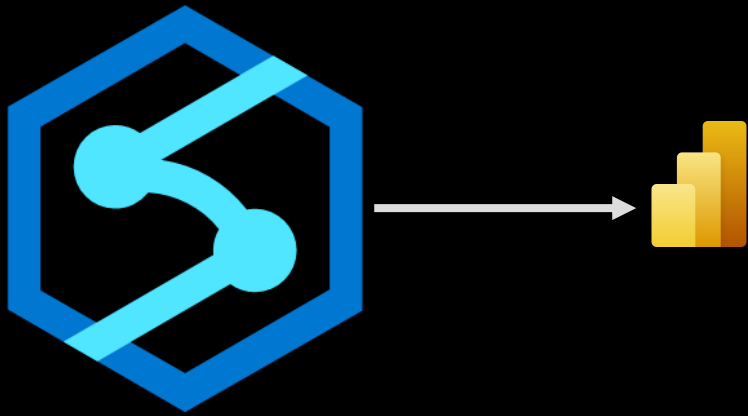
## Cost

Implement a cost-efficient solution, that still meets the scalability demands.

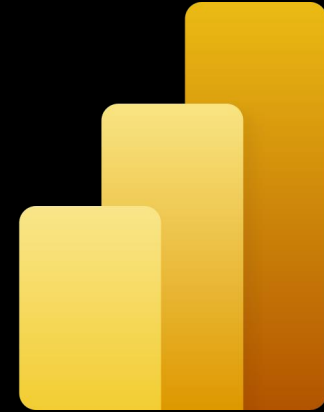
# Solution challenges

# two separate worlds

## Data Platform



## Power BI





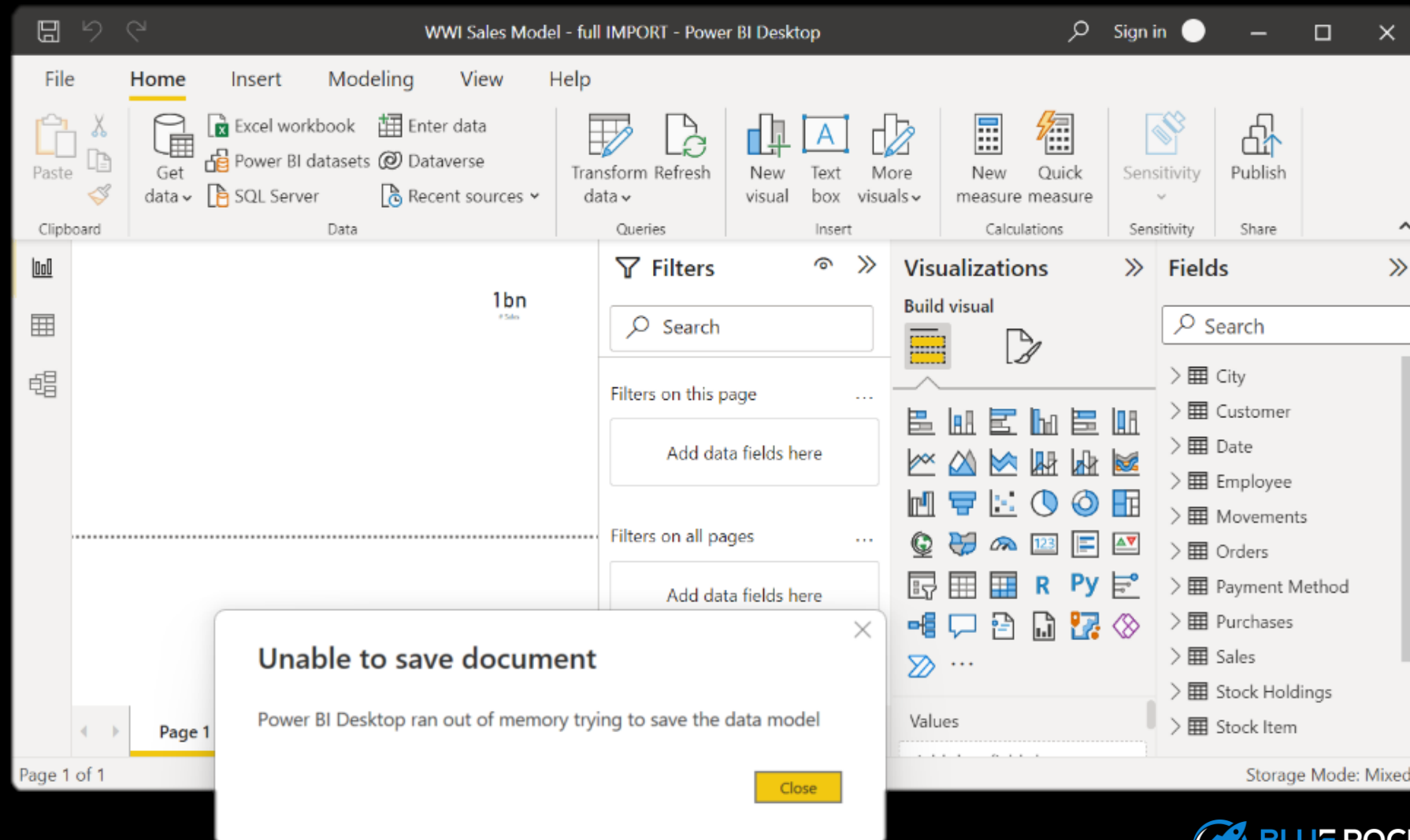
# Data Platform Solution Challenges

- Power BI report can't handle the volume of data
- Showing near real-time data in Power BI report





# Power BI report can't handle the volume





Should I put everything on  
DirectQuery instead?



# DirectQuery limitations

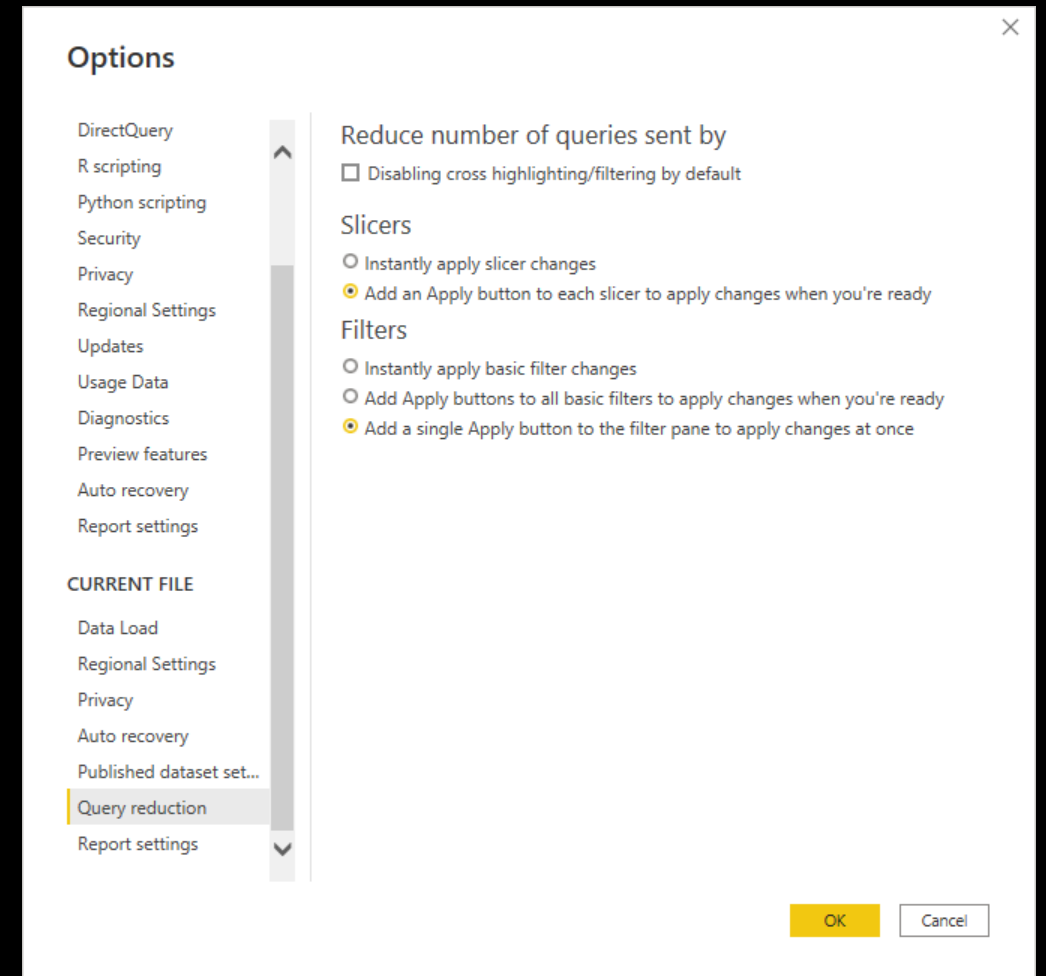
- Limited Power Query capabilities
- DirectQuery != streaming / live! Front-end still caches data
- No built-in date hierarchy (year/quarter/month/day)
- Lowest granularity data is seconds (no milliseconds)
- No parent-child support in DAX with *PATH()*
- Slower end user performance
- 1M row per query
- DAX limitations, only simple calculations possible

# DirectQuery query reduction

Consider requesting to click **Apply** before queries are executed to the source

Applies to

- Slicers
- Filters (filter pane)





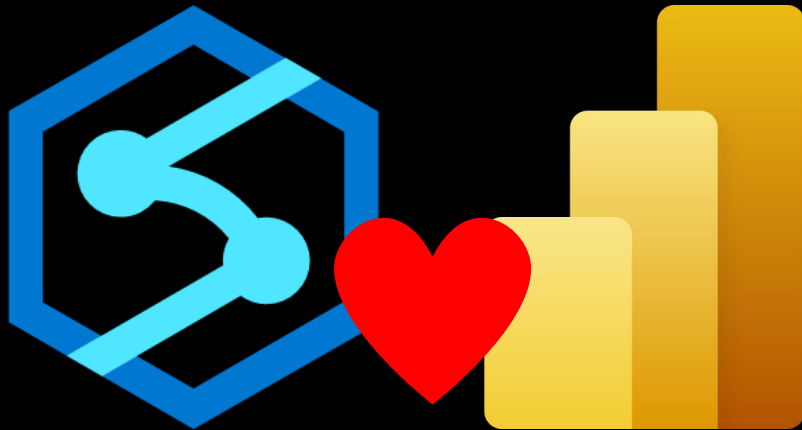
# Showing near real-time data in Power BI

- Refresh takes too long
- Poor end-user performance on DirectQuery
- Streaming datasets only allow one table
- Potentially queries are not foldable, therefore incremental refresh does not work (depending on source)



# Data Platform Solution ~~Challenges~~

- Optimize Power BI model
- Use Aggregations
- Use Hybrid Table
- End-2-end orchestration





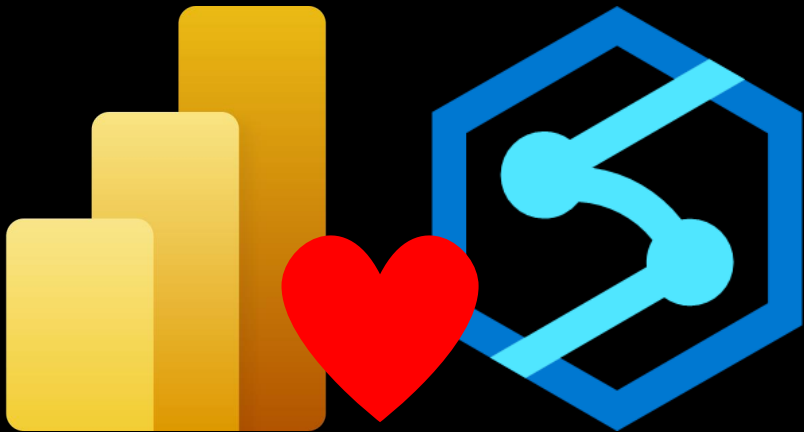
# Power BI Solution Challenges

- Loading data from challenging sources (flat files, APIs)
- Some sources are manually maintained (like mapping tables)
- Data stored on decentralized storages, like SharePoint pages.
- Data from source systems are exported, rather than connected to analytical systems
- Store historical data in Power BI for trend analysis



# Power BI Solution ~~Challenges~~

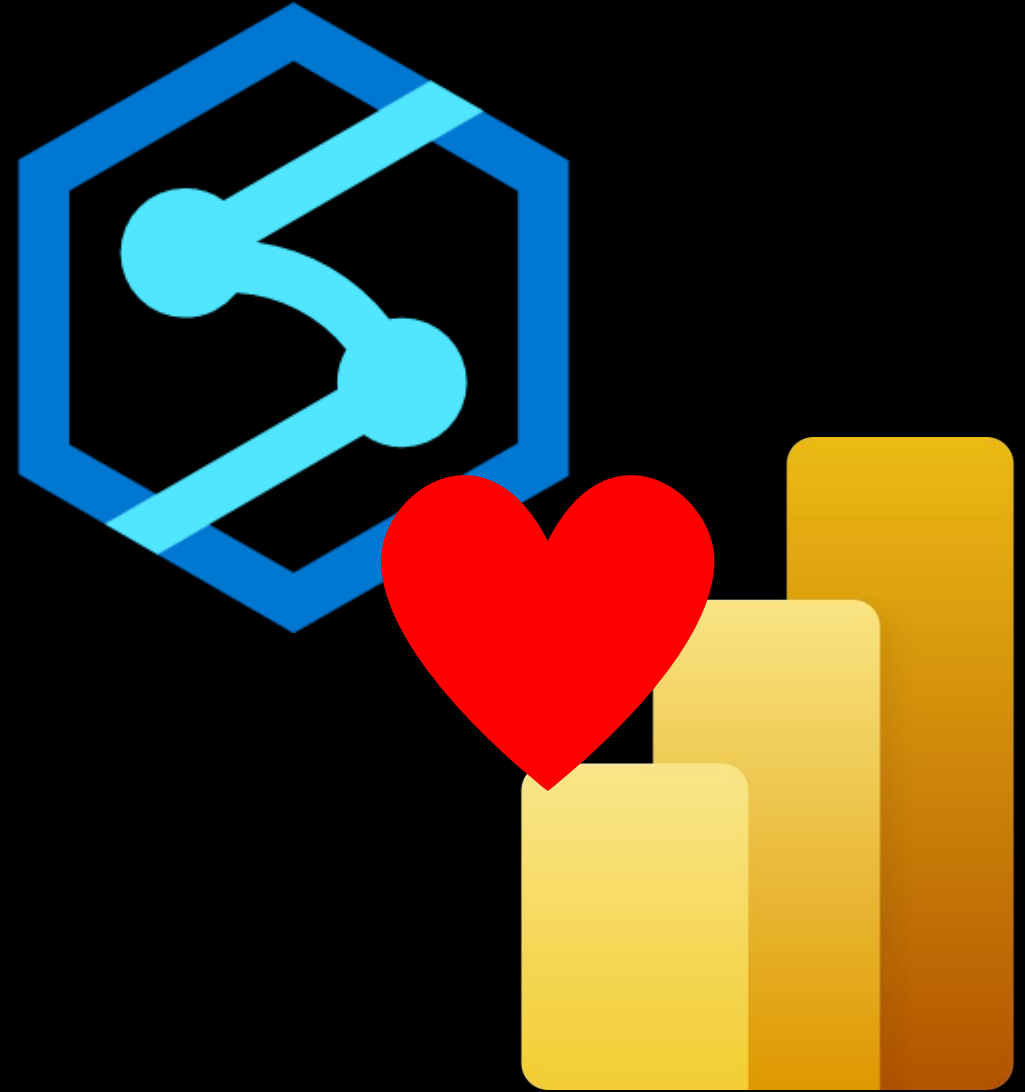
- Use Synapse Analytics to ingest data
  - Easily connect to various types of data sources
- Use Data Lakehouse: Bronze, Silver & Gold layers
  - Easily store historical data





# Better together

Data platform deep dive



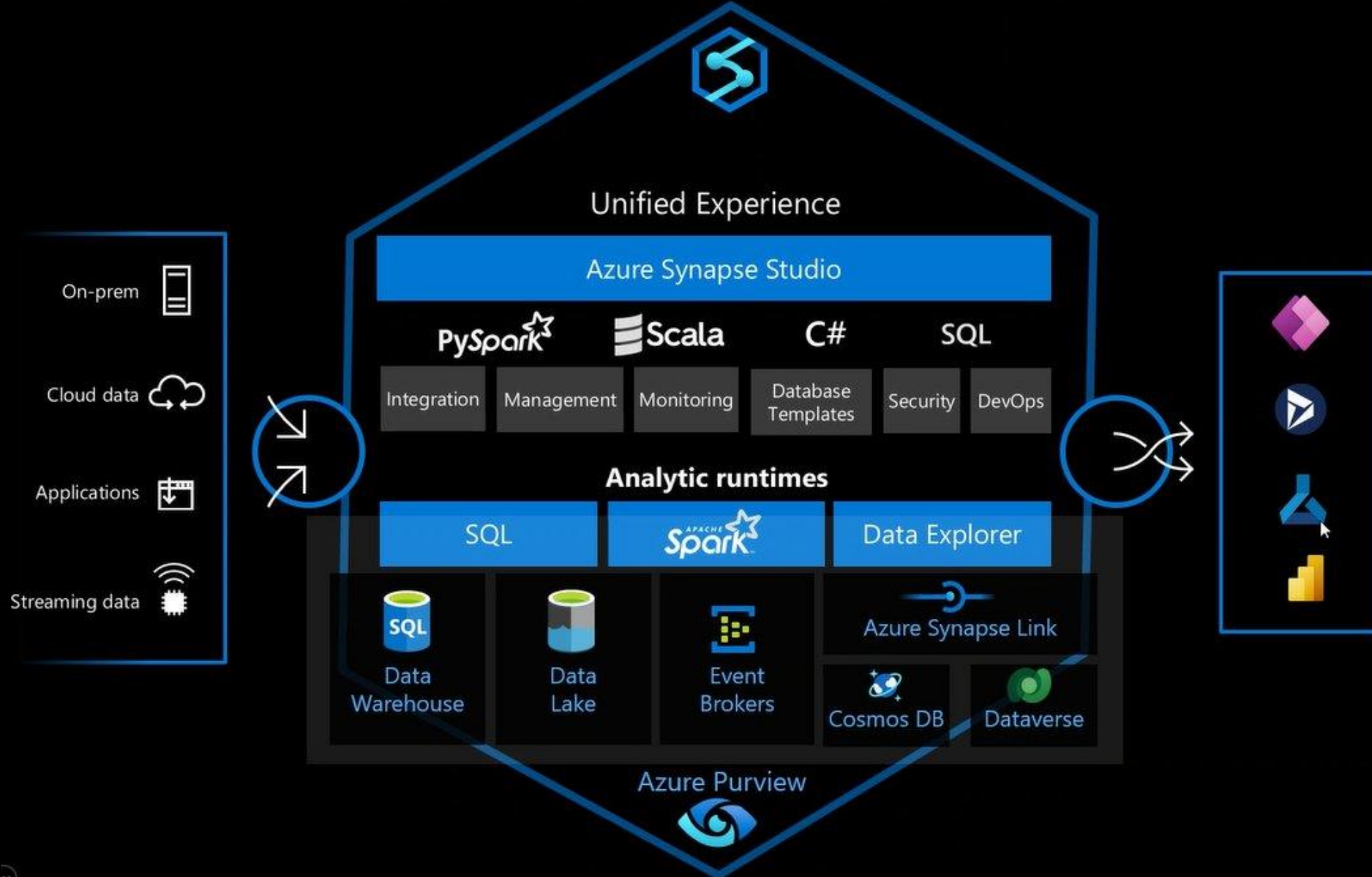


# Improvement areas

- Ingesting data from APIs using Synapse Analytics
- Store (historical!) data in the delta lakehouse architecture

# Azure Synapse Analytics

The first unified, cloud native platform for converged analytics





# Ingesting data from APIs using Synapse Analytics

- Pipeline (same as ADF)
- Data Flow (same as ADF) *not to be confused with dataflows in PBI*
- Spark Notebook (4 languages available)
- Wrangling Dataflows (Same as ADF)



# Store (historical!) data in the lake

- The Layered approach: Bronze, Silver & Gold
- Keep original raw data, build up history -> **bronze**
- Cleanse and refine data, standard file format -> **silver**
- Aggregate, prepare, transform, merge, make start schema -> **gold**



# Store (historical!) data in the lake

- The Layered approach: Bronze, Silver & Gold
- Keep original raw data, build up history -> **bronze**
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- Aggregate, prepare, transform, merge, make start schema -> **gold**

Bronze



Raw data

All history,  
system  
replayable

Silver



Apply  
metadata

Protect data  
(GDPR)

Current &  
historical  
view

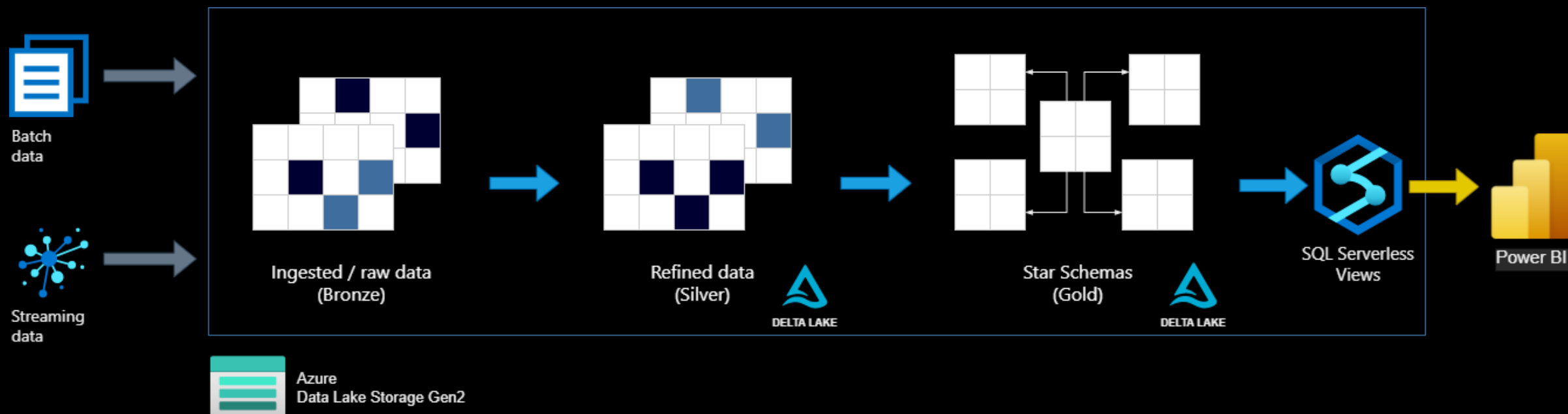
Gold

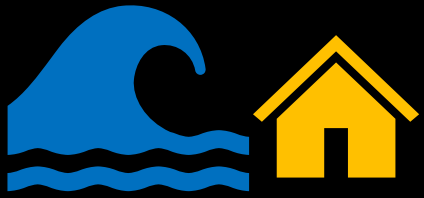


Implement  
business  
rules

Fit for  
purpose

# Using Delta Lakehouse with layered approach





# Demo Data Platform Lakehouse architecture





# Warm-up time of Serverless SQL pools

## SQL requests

Refresh Edit columns

Filter by keyword

Local time : **Last 24 hours**

Status : **All**

Pool : **Built-in**

Add filter

Showing 1 - 4 of 4 items

Request ID	Request content	Submit time	Duration	Data processed
44196195	SELECT TOP (1000... <a href="#">More</a>	3/6/22, 10:45:14 AM	14 sec	5.12 GB
44190548	SELECT TOP (1000... <a href="#">More</a>	3/6/22, 10:43:13 AM	16 sec	4.34 GB
44187683	SELECT TOP (1000... <a href="#">More</a>	3/6/22, 10:42:32 AM	14 sec	6.12 GB
44178591	SELECT TOP (1000... <a href="#">More</a>	3/6/22, 10:39:55 AM	20 sec	6.11 GB

Sales Territory	\$ Sales
External	\$12,540,565,587.63
Far West	\$130,724,597,536.11
Great Lakes	\$137,062,180,086.18
Midwest	\$170,472,095,945.05
New England	\$58,853,530,841.09
Plains	\$154,405,133,753.92
Rocky Mountain	\$72,387,209,160.70
Southeast	\$258,110,199,285.25
Southwest	\$141,628,285,606.20
<b>Total</b>	<b>\$1,136,183,797,802.13</b>



# Best practices for serverless SQL pools

- Azure AD Pass-through Authentication performance  $\leq$  shared access signature credentials
- Colocate
- Same region
- Convert large CSV and JSON files to Parquet
- Try to optimize storage layout by using partitioning and keeping your files in the range between 100 MB and 10 GB
- Use appropriate data types (smallest, integer-based, varchar)
- Use filename and filepath functions to target specific partitions

# Better together

Power BI deep dive





# Improvement areas

- Data model
- Query Folding
- Aggregations
- Storage modes
- Hybrid tables



# But before we start changing our solution, let's measure...

- Refresh durations
- Model Size
- Vertipaq Analyzer
- Performance Analyzer
- Query folding applied?



## Perfect E2E.pbix

Total Size

**74,89 MB**



Last Data Refresh

1-3-2022 20:05:54 +01:00

Analysis Date

1-3-2022 20:05:55 +01:00

Compatibility

1550

Tables

7

Columns

124

Server

localhost:60032



# Performance analyzer in Power BI Desktop

Performance analyzer | Sync slicers

Start recording | Refresh visuals | Stop

Clear | Export

Name	Duration (ms) ↓
0.0%	2279
	1440
Simple Image	4331
Net Sales vs "What If" Analysis	2391
OneNote	2543
"What If" Analysis Forecast	50
Changed a slicer	-
What If...	128
Return Rate	1028
Net Sales (Forecast)	1618
Extra Profit	2046
Card	1425
"What If" Analysis Forecast	1890
Returns	2249
OneNote	1155
	1723
	1722
	1723
Button	398
Last Refresh: Jun 30th, 2019 / ...	397
\$30,772	2107
+17.1%	1528
	1715
"What If" Analysis Forecast	388
Simple Image	2721

Learn more about optimizing your report's performance on our [support site](#). Find help tuning your report from specialist Power BI partners on [AppSource](#).

- DAX Query
- Visual Display
- Other
  - Preparing queries
  - Waiting for other visuals to complete
  - Other background processes



# Vertipaq analyzer

See where your data volume is

VertiPaq Analyzer Metrics								
Tables Columns Relationships Partitions Summary								
Name	Cardinality	Table Size	Col Size	Data	Dictionary	Hier Size	Encoding	Data Type
▲ Sales Agg	1.933.444	55.428.208	55.422.984	29.854.056	21.688.736	3.880.192	Many	-
Total Including Tax	119.940	55.428.208	11.252.400	4.973.680	5.319.152	959.568	HASH	Double
Tax Amount	119.137	55.428.208	11.241.312	4.972.888	5.315.288	953.136	HASH	Double
Total Excluding Tax	118.952	55.428.208	11.241.120	4.973.680	5.315.776	951.664	HASH	Double
Profit	113.830	55.428.208	11.139.328	4.975.824	5.252.816	910.688	HASH	Double
Invoice Date Key	1.444	55.428.208	3.109.056	3.013.344	84.112	11.600	HASH	DateTime
Delivery Date Key	1.443	55.428.208	3.109.016	3.013.344	84.072	11.600	HASH	DateTime
Count Rows	9.722	55.428.208	2.356.128	1.974.104	304.200	77.824	HASH	Int64
Customer Key	403	55.428.208	1.929.700	1.916.016	10.420	3.264	HASH	Int64
Salesperson Key	101	55.428.208	44.804	41.176	2.780	848	HASH	Int64
RowNumber-2662979B-1795-4F74-8F37-6A1BA8059B61	0	55.428.208	120	0	120	0	VALUE	Int64
▶ Date	3.287	23.045.462	22.981.430	73.096	22.805.342	102.992	Many	-
▶ Customer	403	6.436.260	6.436.260	2.448	6.419.380	14.432	Many	-
▶ Employee	213	2.157.356	2.157.356	1.120	2.151.460	4.776	Many	-
▶ StockItem	0	8.576	8.576	160	8.416	0	HASH	-
▶ Sales	0	8.392	8.352	176	8.176	0	HASH	-
▶ sales_model Employee	0	8.352	8.352	176	8.176	0	HASH	-
▶ City	0	6.496	6.496	112	6.384	0	HASH	-



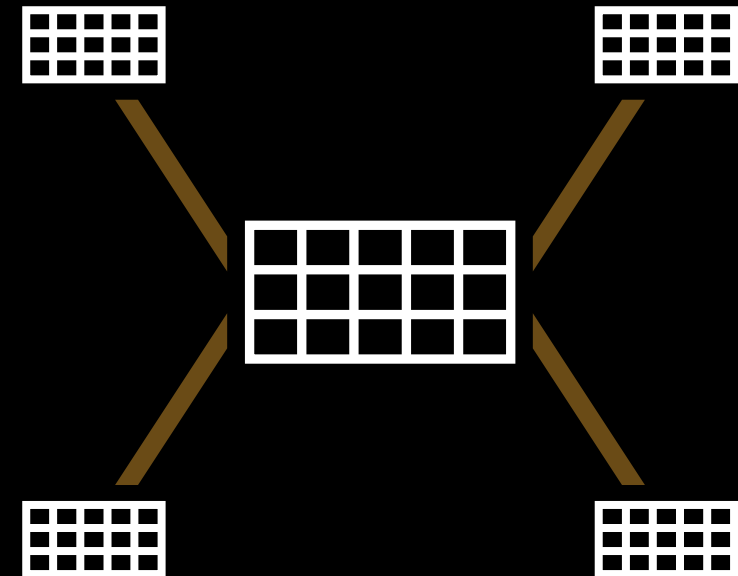
# Star schema all the things!

## Facts

- Contains **numerical information** about a business process or items to be aggregated
- Aggregations provide totals, averages, etc.  
Power BI implements these using **Measures**
- Usefulness limited without context  
Context is provided by **dimensions** that slice the data

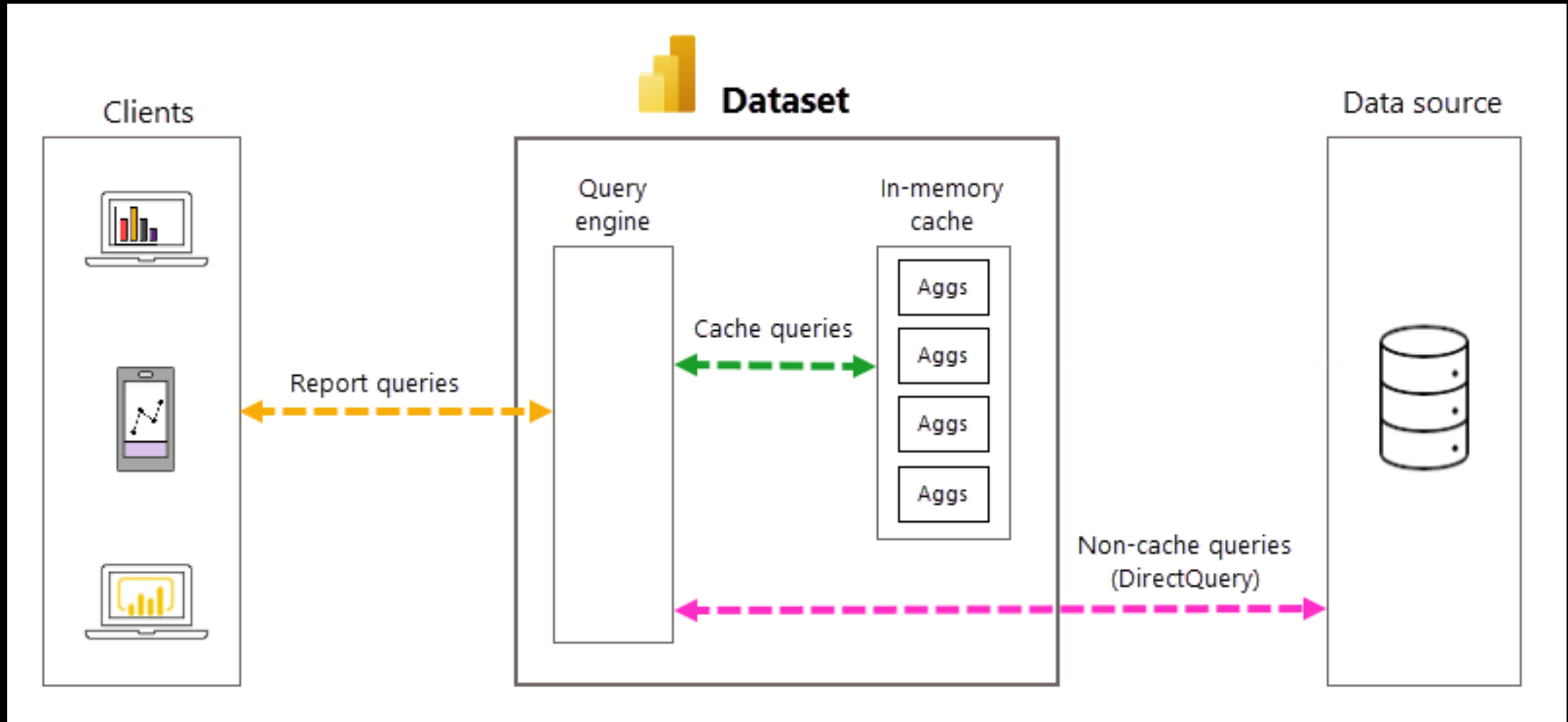
## Dimensions

- Contains **descriptive information** that define how a fact should roll up.
- Examples: Date, Month, Customer, Geography, Product, Payment type.
- Without dimensions there is no context.
- Also called: Lookup table on steroids.





# Aggregations

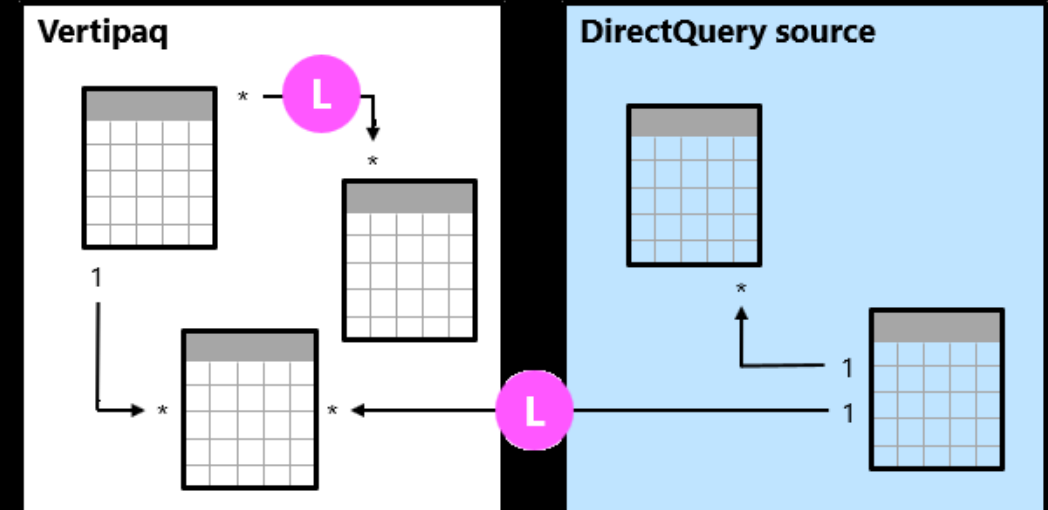




# Relationships and storage modes

A model relationship is **limited** when there's no guaranteed "one" side. It can be the case for three reasons:

- The relationship uses a Many-to-many cardinality type (even if one or both columns contain unique values)
- The storage mode combination is Import and DirectQuery
- The relationship is cross source group





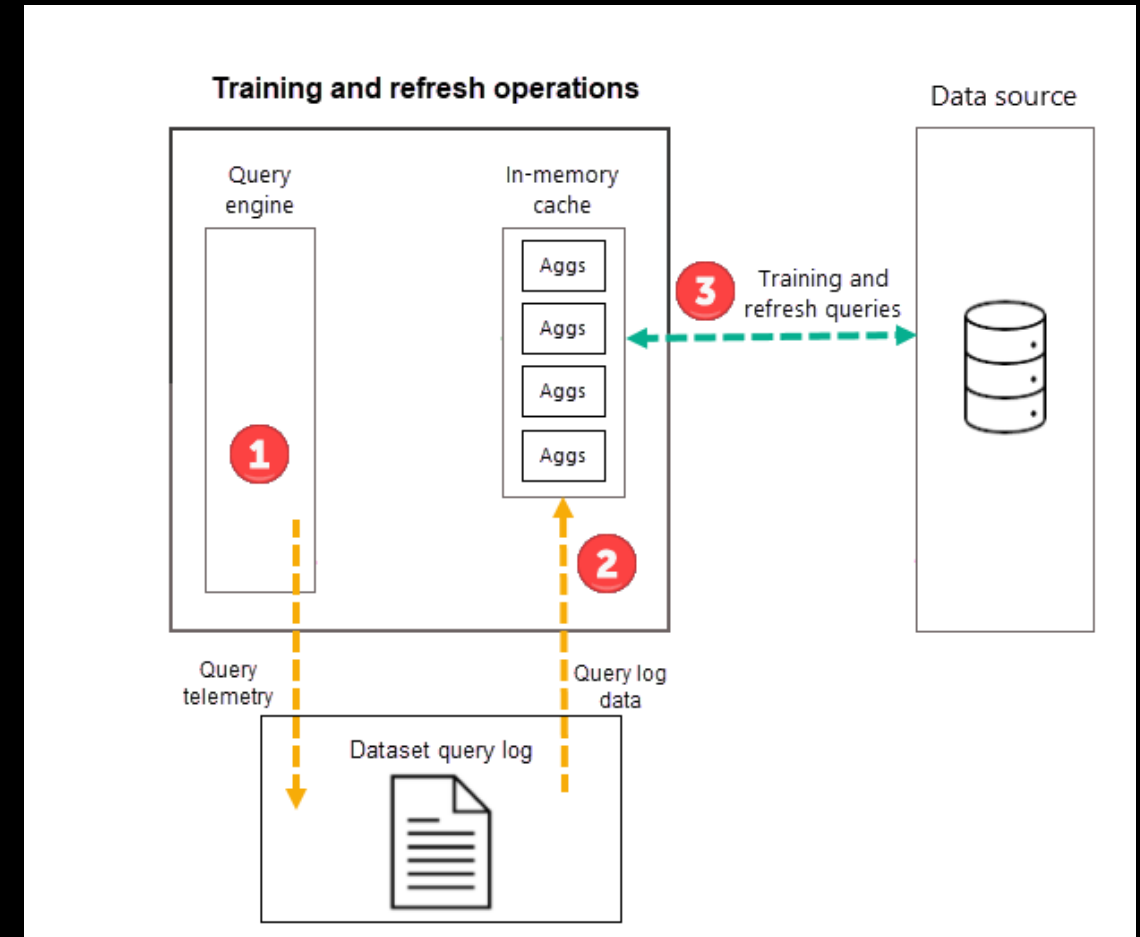
# Automatic Aggregations

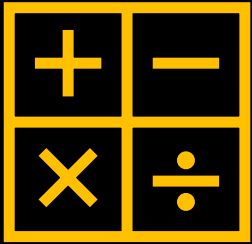
**Power BI Premium per User, Premium Capacity and Embedded datasets**

**Automatic aggregations based on Query logs (7 days)**

**Supported sources:**

- Azure SQL Database
- Azure Synapse Dedicated SQL pool
- Google BigQuery
- Snowflake





# — Demo Aggregations

## Aggregated data



*{ Query }*



## Detailed data



# Hybrid tables & incremental refresh



# Incremental refresh

- Incremental refresh is supported for Power BI Premium, Premium per user, **Power BI Pro**, and Power BI Embedded datasets.
- Getting the latest data in **real time** with DirectQuery is **only supported for Power BI Premium**, Premium per user, and Power BI Embedded datasets.

# Incremental refresh config

Manage Parameters

New

RangeStart

RangeEnd

Name: RangeStart

Description:

☒ Required

Type: Date/Time

Suggested Values: Any value

Current Value: 1/25/2014 12:00:00 AM

OK Cancel

CustomerPONumber OrderDate DueDate ShipDate

Sort Ascending

Sort Descending

Clear Sort

Clear Filter

Remove Empty

Date/Time Filters

Search

☒ (Select All)

☒ 12/29/2010 12:00:00 AM

☒ 12/30/2010 12:00:00 AM

☒ 12/31/2010 12:00:00 AM

☒ 1/1/2011 12:00:00 AM

☒ 1/2/2011 12:00:00 AM

☒ 1/3/2011 12:00:00 AM

☒ 1/4/2011 12:00:00 AM

☒ 1/5/2011 12:00:00 AM

☒ 1/6/2011 12:00:00 AM

☒ 1/7/2011 12:00:00 AM

☒ 1/8/2011 12:00:00 AM

☒ 1/9/2011 12:00:00 AM

☒ 1/10/2011 12:00:00 AM

☒ 1/11/2011 12:00:00 AM

☒ 1/12/2011 12:00:00 AM

☒ 1/13/2011 12:00:00 AM

☒ 1/14/2011 12:00:00 AM

! List may be incomplete. Load more

OK Cancel

Custom Filter...

## Incremental refresh and real-time data

Refresh large tables faster with incremental refresh. Plus, get the latest data in real time with DirectQuery (Premium only). [Learn more](#)

① These settings will apply when you publish the dataset to the Power BI service. Once you do that, you won't be able to download it back to Power BI Desktop. [Learn more](#)

### 1. Select table

FactInternetSales

### 2. Set import and refresh ranges

☒ Incrementally refresh this table

Archive data starting 5 Years before refresh date

Data imported from 12/21/2016 to 12/18/2021.

Incrementally refresh data starting 3 Days before refresh date

Data will be incrementally refreshed from 12/18/2021 to 12/21/2021.

### 3. Choose optional settings

☒ Get the latest data in real time with DirectQuery (Premium only) [Learn more](#)

☒ Only refresh complete days [Learn more](#)

☐ Detect data changes [Learn more](#)

### 4. Review and apply

Archived Incremental Refresh Real time

5 years before refresh date 3 days before refresh date Refresh date

Apply Cancel





# Hybrid tables

- Live / Realtime data in Power BI
- Combines different storage modes on partition level in a single table
- Goes hand-in-hand with Incremental Refresh

Granularity	Name	Row Count	
Year	2011	295,489,717	Archived: <b>Import</b>
Year	2012	297,678,498	
Year	2013	295,575,442	
Year	2014	292,477,875	
Year	2015	297,780,469	
Year	2016	294,060,081	
Year	2017	300,419,682	
Year	2018	296,541,108	
Year	2019	292,787,420	
Year	2020	299,273,979	
Quarter	2021Q1	74,135,277	Incremental refresh: <b>Import</b>
Month	2021Q104	24,939,498	
Day	2021Q10501	820,805	
Day	2021Q10502	826,885	Real time: <b>DirectQuery</b>
Day	2021Q10503	821,043	
Day-DirectQuery	2021Q10504-DQ	271,110	
Total		3,063,898,887	



# Hybrid tables

- Implementation with Incremental Refresh
- Customizable via 3rd party tooling like Tabular Editor

>> Limitation: Only 1 DQ partition per table allowed at the moment.

×

Incremental refresh and real-time data

ⓘ

These settings will apply when you publish the dataset to the Power BI service. Once you do that, you won't be able to download it back to Power BI Desktop. [Learn more](#)

1. Select table

Sales Agg

2. Set import and refresh ranges

☒

Incrementally refresh this table

Archive data starting 

Years

 before refresh date

Data imported from 3/2/2012 to 2/20/2022.

Incrementally refresh data starting 

Days

 before refresh date

Data will be incrementally refreshed from 2/20/2022 to 3/2/2022.

3. Choose optional settings

☒

Get the latest data in real time with DirectQuery (Premium only) [Learn more](#)

☒

Only refresh complete days [Learn more](#)

☐

Detect data changes [Learn more](#)

4. Review and apply

10 years before refresh date

Archived

10 days before refresh date

Incremental Refresh

Real time

Refresh date

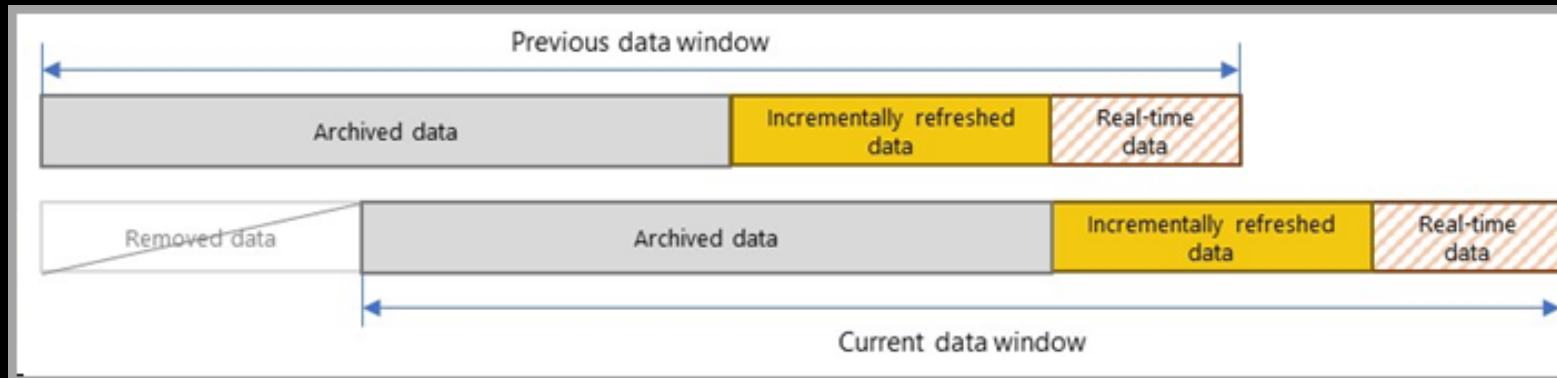
Apply

Cancel



# Hybrid tables – what challenge does it solve?

- Realtime scenarios without full tables on DQ mode
- No complex refresh mechanisms needed with partition refresh and queries over XMLA
- No more multiple tables and complex DAX to combine to achieve the same goal





# Hybrid tables – Keep in mind that...

- Premium feature
- DAX restrictions for DirectQuery apply
- Limited Power Query capabilities (due to DQ)
- Requires Large Dataset Format (storage) in workspace
- Performance hit on upstream data sources



# Demo Hybrid Tables Latest data in real time



Hybrid Table
...
May 2022
June 2022
...
...
...

}

Import

}

DirectQuery

→

Sales Hybrid	168.111.676
2022Q20602-onward	0
2022Q20601	30
2022Q205	0
2022Q204	0
2022Q103	2.080
2022Q102	0
2022Q101	82.191.780
2021Q412	85.917.786

# Refresh challenges



# Refresh options

- Scheduled in the service
- Manual trigger
- Power Automate
- PowerShell
- API





# Effective refreshing

## Considerations

- Refreshing the entire model takes too long with high load on sources
- Can we only refresh certain tables?
- Can we only refresh certain partitions?
- Can we use DQ tables/partitions (Hybrid Tables)

## What do we need?

- Async refresh API
- XMLA Endpoints



# Async refresh API

- Specify the objects to refresh

POST

<https://api.powerbi.com/v1.0/myorg/groups/f089354e-8366-4e18-aea3-4cb4a3a50b48/datasets/cfafbeeb1-8037-4d0c-896e-a46fb27ff229/refreshes>

```
{
  "type": "Full",
  "commitMode": "transactional",
  "maxParallelism": 2,
  "retryCount": 2,
  "objects": [
    {
      "table": "DimCustomer",
      "partition": "DimCustomer"
    },
    {
      "table": "DimDate"
    }
  ]
}
```

# Wait a sec...

[ADMIN](#)[ANALYSIS SERVICES](#)[ANNOUNCEMENTS](#)[API](#)[FEATURES](#)[POWER BI](#)

## Enhanced refresh with the Power BI REST API is now generally available



**Ogbemi Ekwejunor-Etchie**  
Program Manager

June 2, 2022

[in Share](#)[Tweet](#)[Like](#)

We're excited to move Enhanced refresh with the Power BI REST API (formerly asynchronous refresh) [from public preview to general availability in Power BI Premium, Power BI Premium per User, and Power BI Embedded](#). As noted in the public preview announcement, this feature had examples.

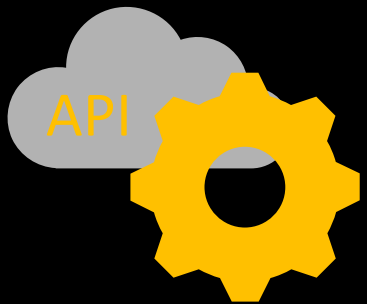
- Cancel an in-progress refresh operation.
- Check the status of historical, current, and pending refreshes.
- Refresh individual tables and individual partitions.



# Central E2E orchestration

- Combine pipelines from Data Platform with Power BI
- Lowest latency between source and report
- Consider including backup operations for Power BI
- Incremental loading where possible





# — Demo end-2-end orchestration

# Scaling



# Scaling data platform

- Spark Cluster:
  - Use multiple cluster configs
  - Autoscale -> *It can take 1 to 5 minutes for a scaling operation to complete*
  - Dynamic allocation of executors
  - Automatic pause

Size	vCore	Memory
Small	4	32 GB
Medium	8	64 GB
Large	16	128 GB
XLarge	32	256 GB
XXLarge	64	512 GB
XXX Large (Isolated Compute)	80	504 GB



# Auto-scale (gen2 only)

## Auto-scale adds:

- Additional vCores
- Applies for at least 24h

## Configured through

- Max. number of scalable vCores
- Azure subscription – Pay as you go

Power BI Premium > AutoScale test

**Premium Generation 2 (preview)**  
Improve performance and easily track your usage with Premium Generation 2. Enable the preview today. Note: Once enabled, the capacity stops emitting metrics to the metrics app. [Learn more](#)

☒ Enabled

**Size | P1**

**8**

Base v-cores

**Auto scale | On**

**0**

Additional v-cores in use  
Max = 2

The Premium SKU size you purchased is a P1, which gives you access to 8 v-cores.

[Change size](#)

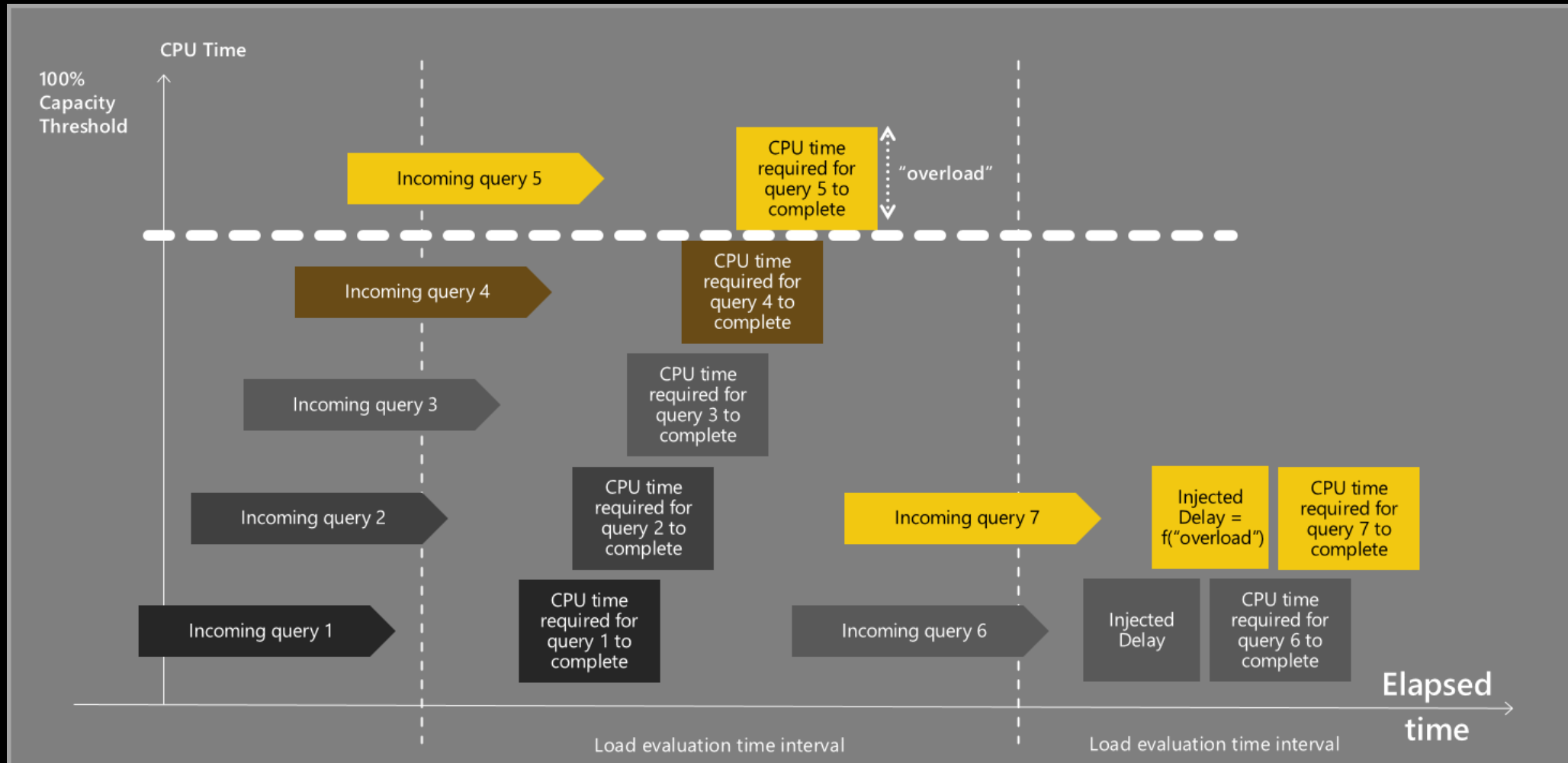
Auto-scale gives the flexibility to use as much capacity as you need, when you need it. [Learn more](#)

[Manage auto-scale](#)



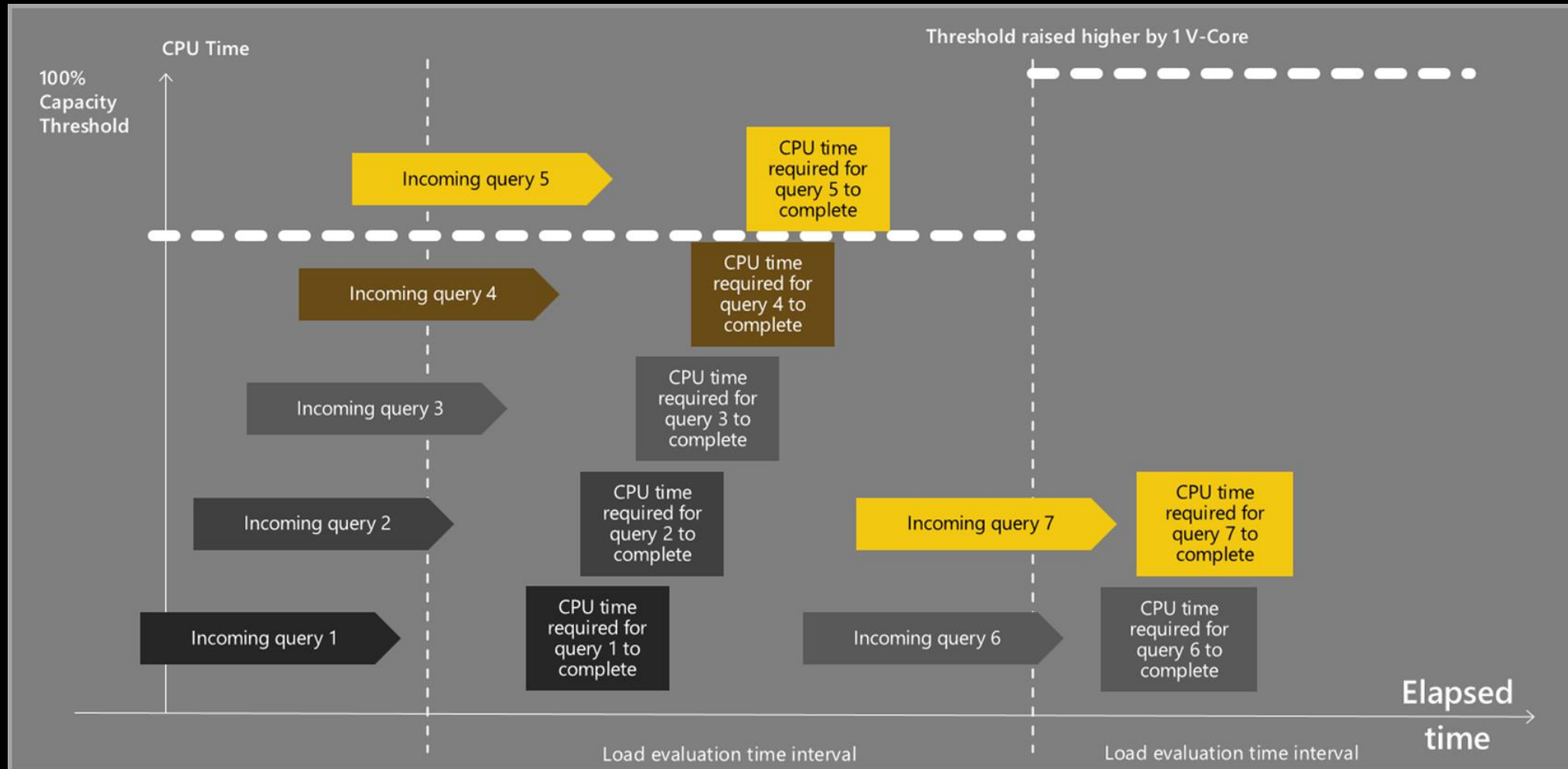


# Power BI Premium – Auto scale





# Power BI Premium – Auto scale



# Wrap-up

## Design and implement

Better design and implement complex data models, including hybrid tables, aggregations, and combined storage modes (import, DirectQuery , dual).

## Orchestrate

Orchestrate the end-to-end data processing, with a pipeline chain from data ingest in the data lake house to the incremental Power BI dataset refresh.

## Performance

Use different techniques to identify performance bottlenecks in your solutions and how to solve those ("does it fold"?).

## Cost

Implement a cost-efficient solution, that still meets the scalability demands.

# Thanks for attending!

Please fill in the evaluation

[Evals.datagrillen.com](https://Evals.datagrillen.com)