



Increasing Trustworthiness of Power BI Content in Microsoft Fabric

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Coates Data Strategies



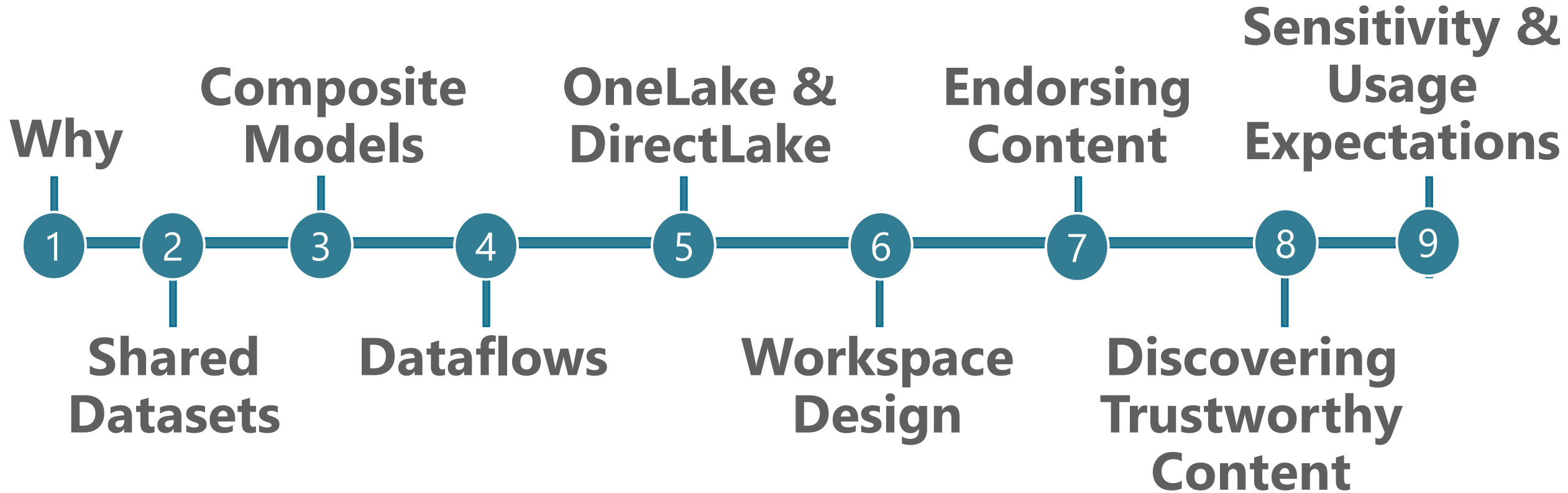
Slides & recordings: CoatesDS.com/Presentations

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Increasing Trustworthiness of Power BI Content



Agenda:



Slides & recordings: CoatesDS.com/Presentations

Melissa Coates



Data architect specializing in Power BI governance & administration

Author of Microsoft guidance:

[Power BI Adoption Roadmap](#)

[Power BI Implementation Planning](#)

Original creator of the [Power BI Deployment & Governance](#) training course (now run by Mike Carlo)





Why Are We Concerned with Trustworthiness?



Business Intelligence Approaches



Business-led self-service BI

Managed self-service BI

Enterprise BI

Data ownership

Decentralized:
Content owned & managed by business unit

Centralized:
Content owned & managed by BI, COE or IT

Data ownership

Report ownership

Report ownership

 For more info, see Power BI Adoption Roadmap: [Content ownership and management](#)



What Do We Mean by Trustworthy Content?

Considerations such as:

Content quality is assured

Owner, SME, and steward responsibilities are clear

Data duplication is minimized

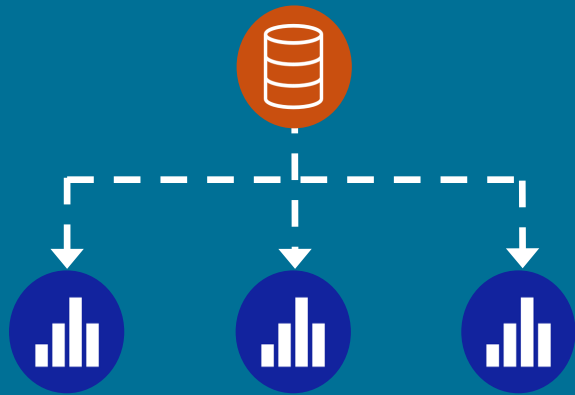
Awareness of content which is discoverable & findable

Approved, common definitions and KPIs are used

Data provenance & lineage are clear

Data & load processes are managed & secured

Clear expectations about responsible data use



Shared Datasets

Achieving Data Model Reuse in Power BI



Where A Lot of Authors Start

In Power BI Desktop:

Datasets:



YTD Sales Revenue



Channel Sales Summary



Product Sales Analysis



Reports:



YTD Sales Revenue



Channel Sales Summary



Product Sales Analysis

One PBIX file

One PBIX file

One PBIX file



Where A Lot of Authors Start

In Power BI Desktop:

Dataset:



Reports:



One PBIX file

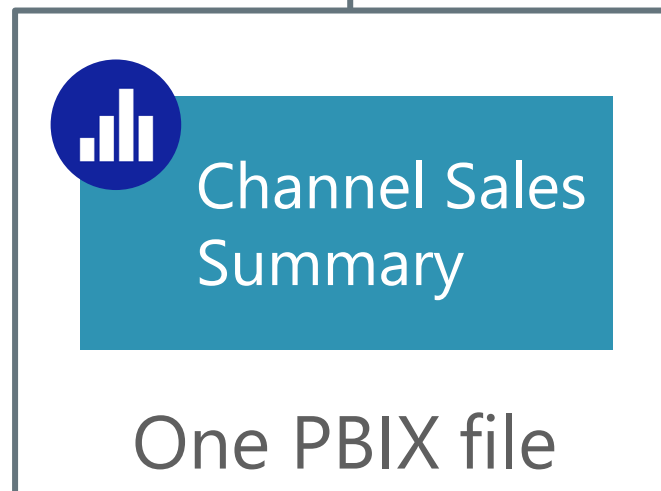


The Goal: Decoupling Data & Reports

Dataset:



Reports:





Decoupling Data & Reports

A **shared dataset** is intended for reuse across multiple reports



Shared dataset:



Sales Data

Live Connection

Analyze In Excel



YTD Sales Revenue

Power BI report



Product Inventory Detail

Paginated report



Channel Sales by Product

Excel report

Also known as:

Golden dataset &
thin reports

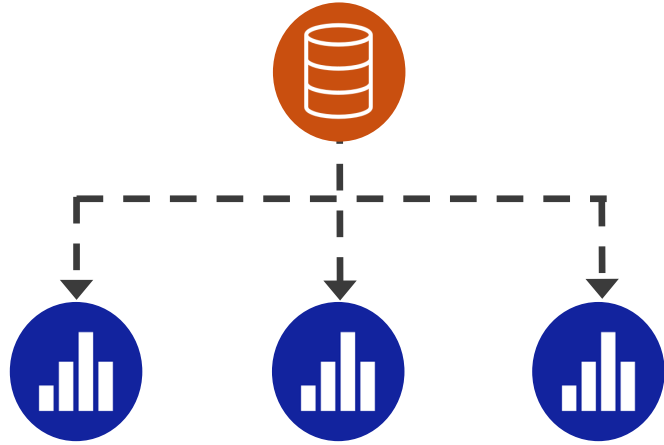
Hub & spoke method



Reports:



Key Advantages of Shared Datasets



Self-Service BI Enablement

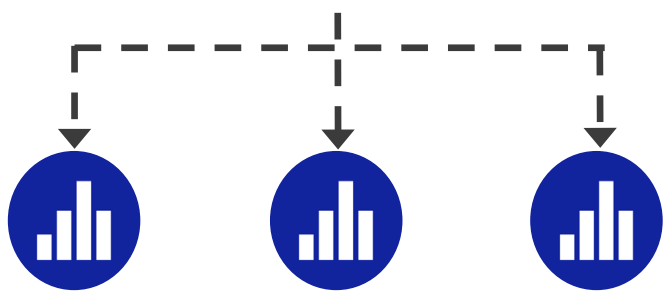
- Different people can handle data modeling and report creation
- Promotes discipline at the core & flexibility at the edge

Follows the Fabric model

- Decoupled datasets follows with how Fabric artifacts get created



Key Advantages of Shared Datasets



Reduced Risk

Fewer datasets results in:

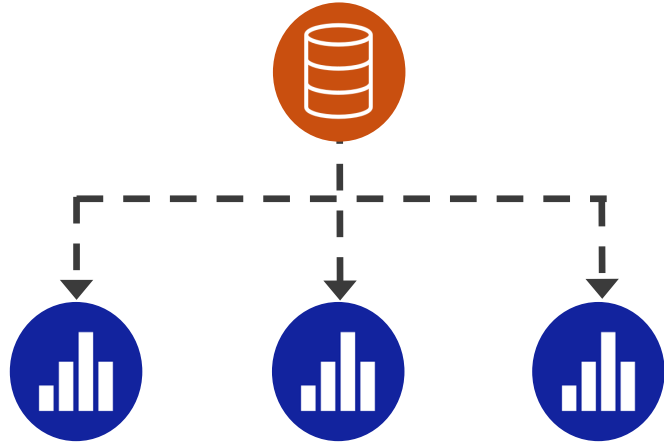
- Fewer inconsistencies
- Reduced maintenance & change effort
- Reduced level of data validations

Less duplication of data results in:

- Lessened governance compliance concerns



Key Advantages of Shared Datasets



Improved Usability for Report Consumers

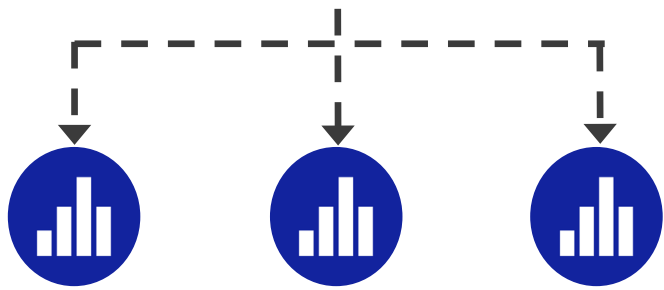
- Reports can each address individual use cases
- Reports contain only as many report pages as are needed

Performance

- Fewer dataset refreshes need to run



Key Advantages of Shared Datasets



Additional Security Options

- Separate PBIX files may be deployed to different workspaces (which may be secured differently)
- Separate reports may be shared individually



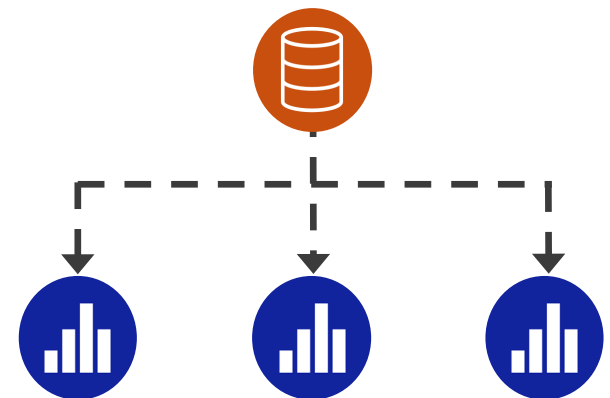
Key Disadvantages of Shared Datasets

❌ Additional oversight

- Favors process over speed
- Should have additional oversight & change control, which isn't desirable for every single dataset

❌ Ownership & responsibility

- Changes may be decided by another team who have different priorities

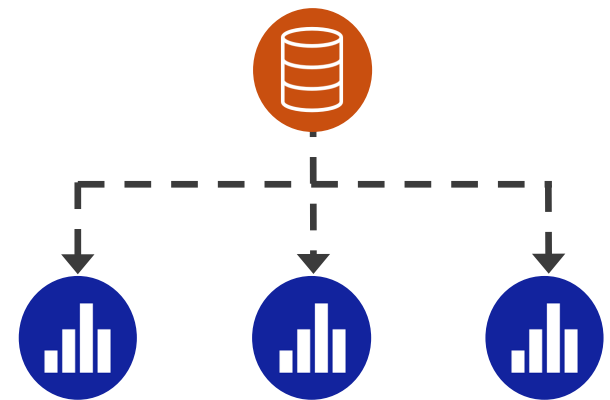




Watch Out For With Shared Datasets

✘ A habit change

- Involves a habit change for dataset authors
- Not an intuitive way to work for brand new self-service authors – need to teach them this concept fairly early in their journey



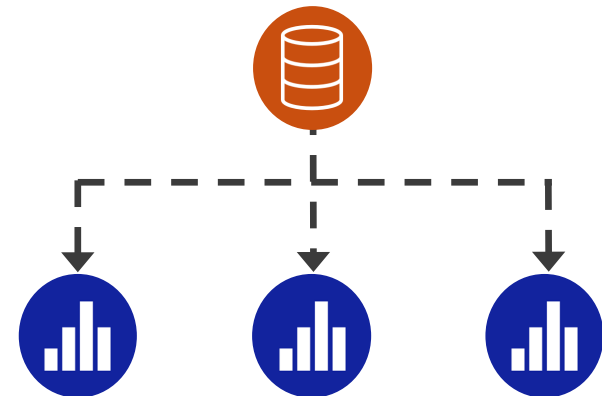


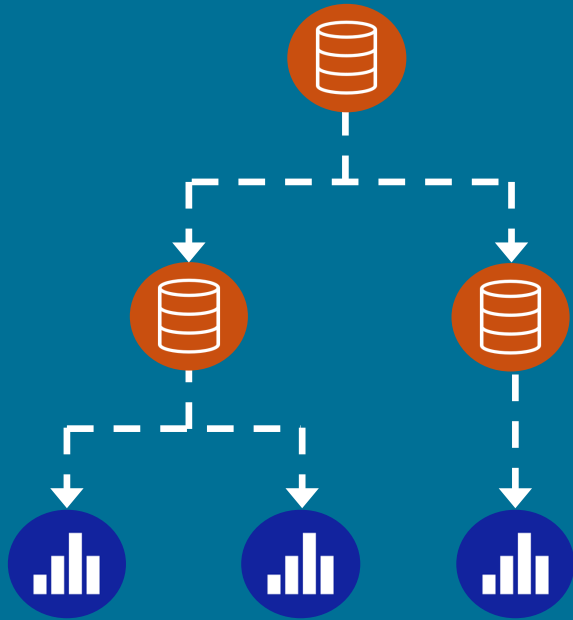
Watch Out For With Shared Datasets

❌ **Complacency, leading to inadequate report testing**

No guarantees that there aren't report errors:

- Report visuals can still be misleading
- Report-level measures can still be incorrect
- Composite models allow extending & customizing the original model, which can introduce confusion or issues



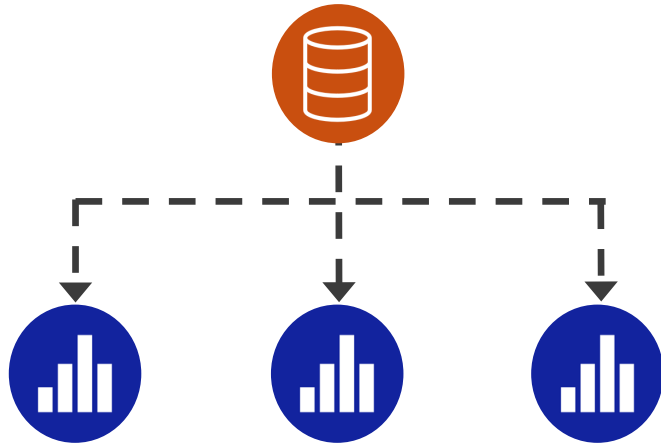


Composite Models

Bridging Enterprise BI and Self-Service BI



What If a Shared Dataset Doesn't Have All the Data That's Needed?

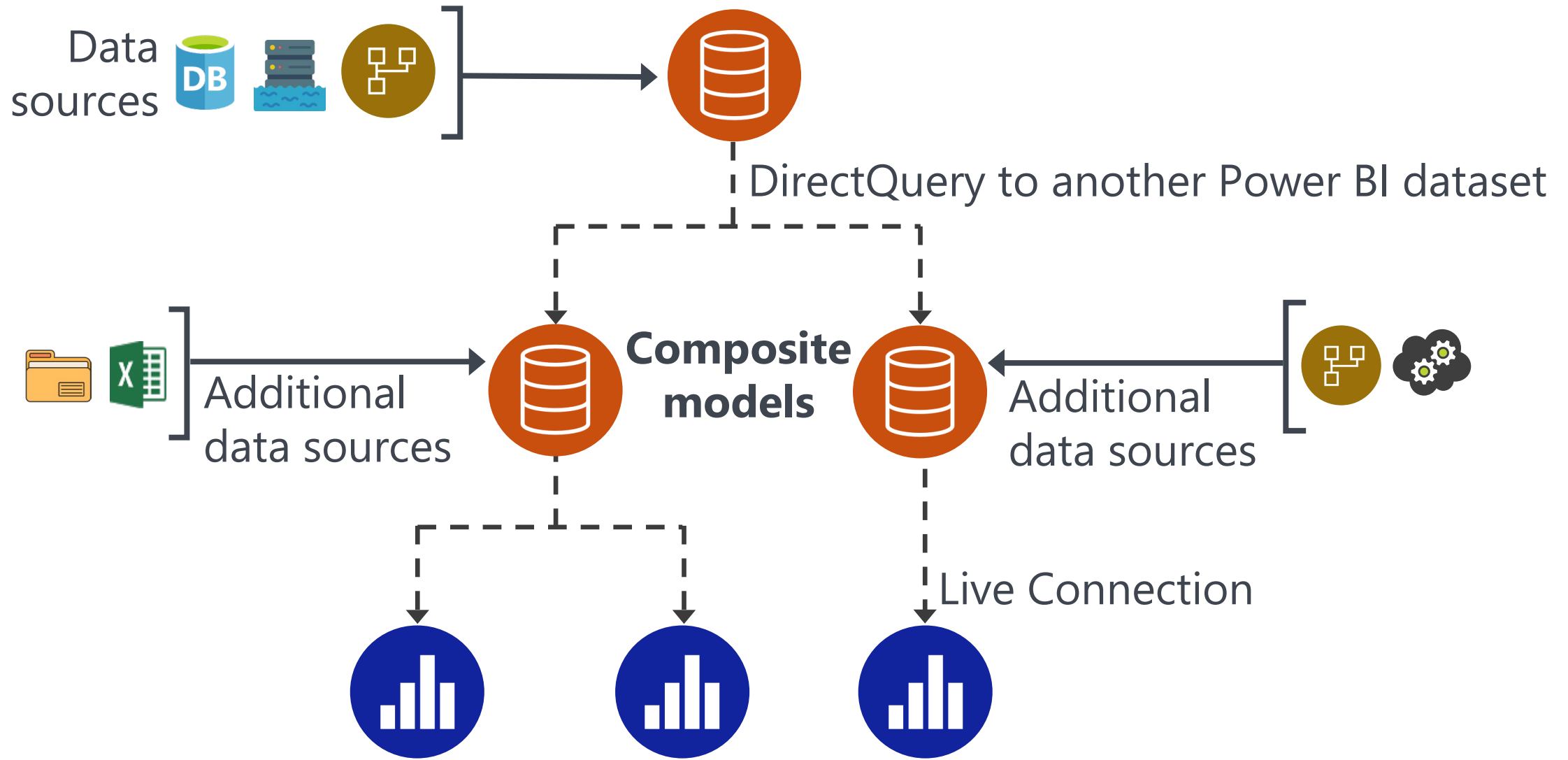


Live connection:

Requires all of the data to be in the data source



Taking Things a Step Further



 For more info, see the [General Availability announcement](#)



Extending & Customizing a Shared Dataset

A **composite model** combines multiple connection types



Shared dataset
(*remote model*):



Organizational
Sales Data

DirectQuery to another Power BI dataset



Composite
model
(*local model*):



Departmental
Sales
Data

Organizational data:
DirectQuery to remote model

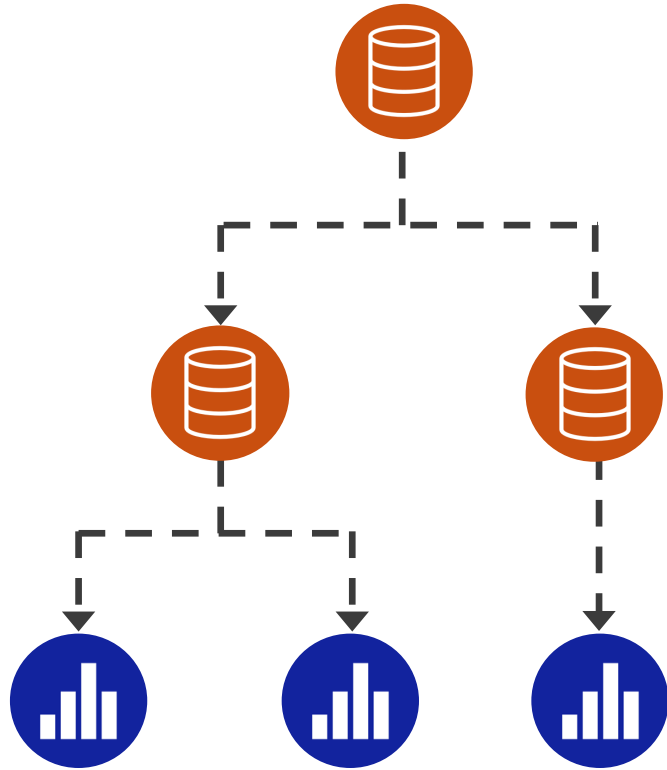
+

Departmental data:
Local model with imported data





Key Advantages of Composite Models



Self-Service BI Enablement

Extend a centralized data model:

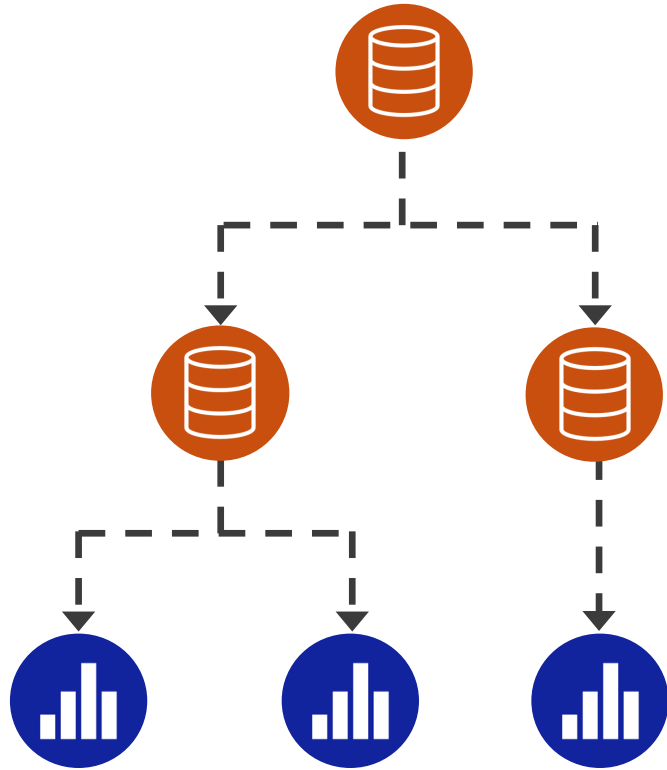
- New data sources, tables, relationships
- New measures & calculated columns
- New hierarchies

Personalize a centralized data model:

- Reformatting & renaming



Key Advantages of Composite Models

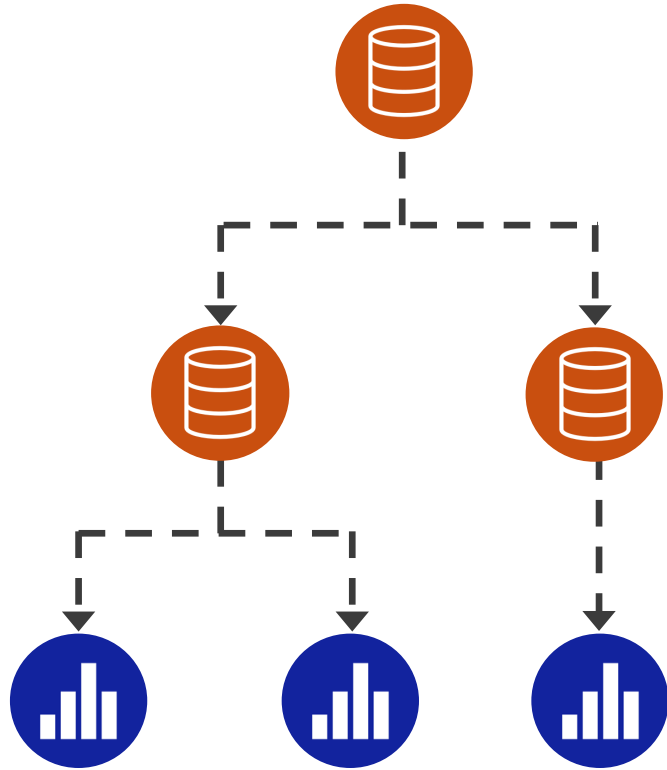


☑ Supports Enterprise BI + Self-Service BI

- Different people managing different datasets
- Promotes discipline at the core & flexibility at the edge
- Less duplication of effort for dataset authors



Key Advantages of Composite Models



☑ Reduced Risk

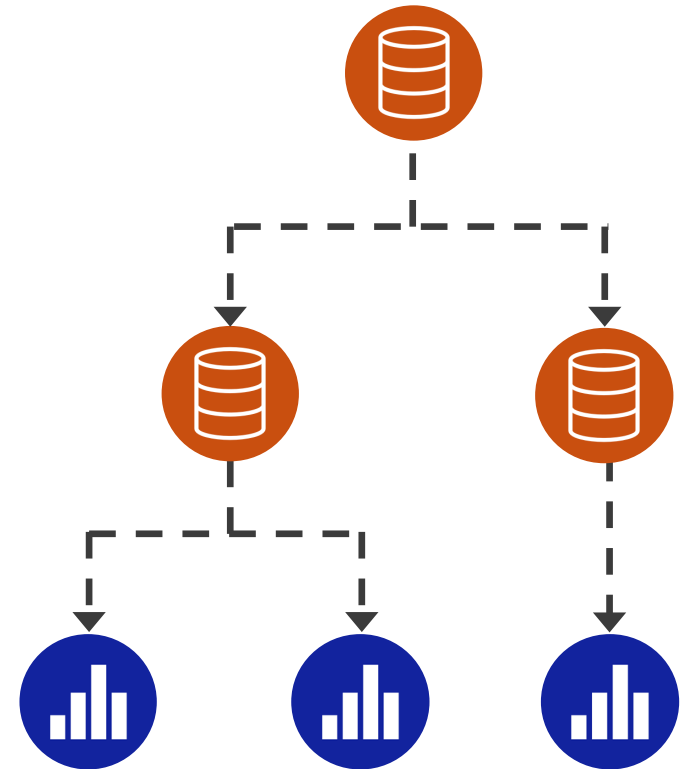
- Reuse of existing data without duplicating it again
- Fewer inconsistencies
- Lessened governance compliance concerns



Key Disadvantages of Composite Models

❌ Performance

- Querying a remote model will never perform as well

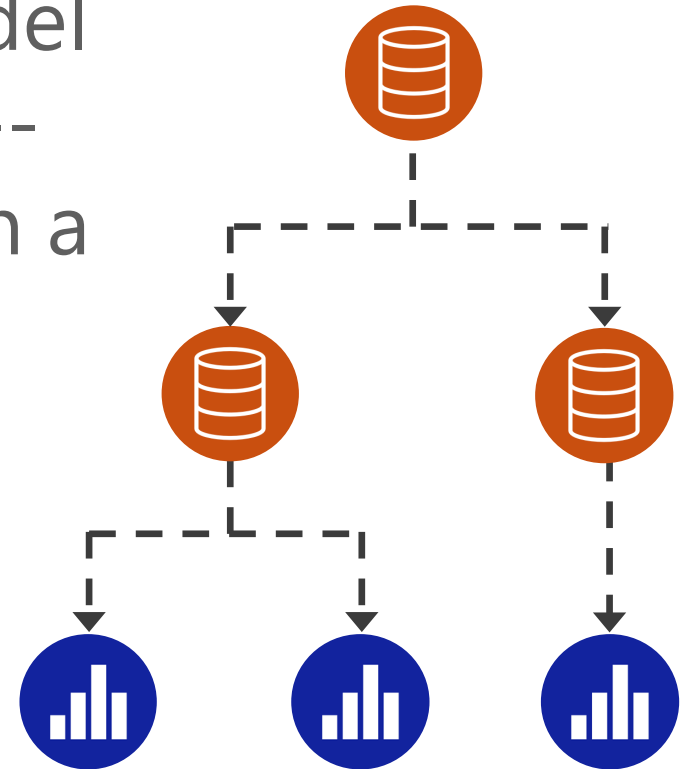




Key Disadvantages of Composite Models

✘ Unexpected Results

- You might not know what the original author had intended for calculations
- DAX formulas created in the remote model might rely on context or other columns -- yielding unexpected results when used in a different way





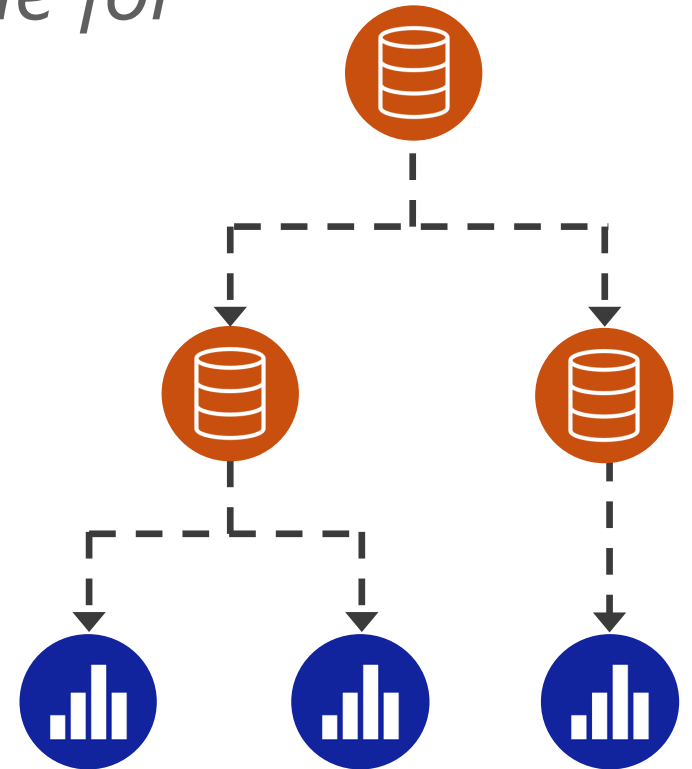
Key Disadvantages of Composite Models

❌ Permissions Requirement (*temporary issue*)

- Requires 'build' permission on all datasets in the chain for all **consumers** of the downstream reports.
(Resolved for Premium/PPU -- still an issue for some Pro workspaces)

❌ Row-Level Security

- RLS needs to be defined on the remote model first (cannot propagate RLS from the local model)





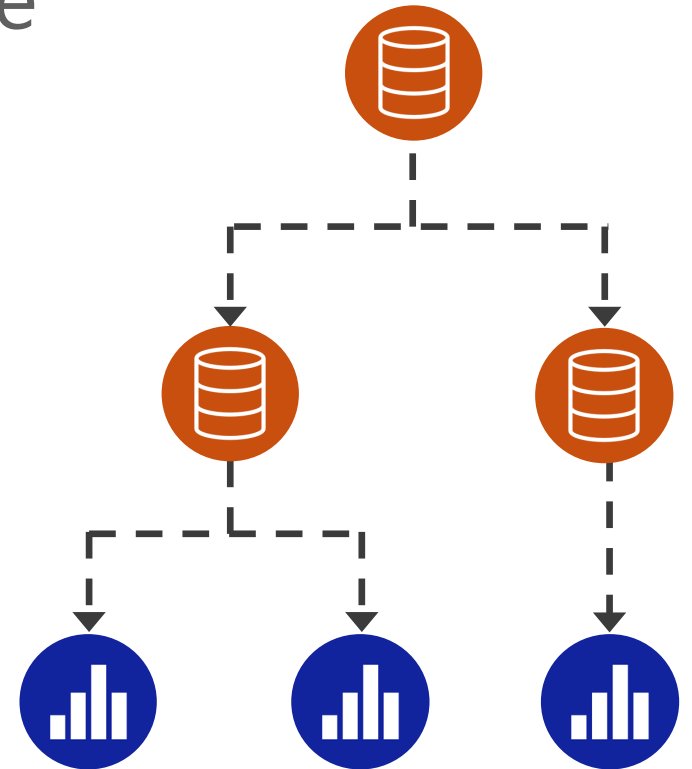
Key Disadvantages of Composite Models

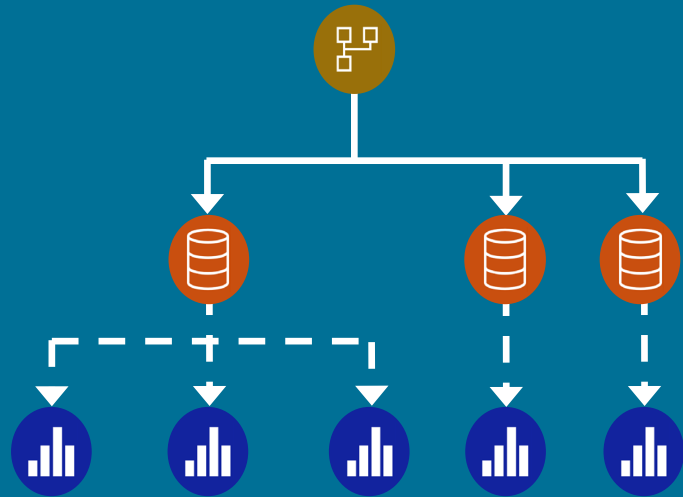
❌ Expectations for Accuracy

- Unreasonable expectations that downstream content is accurate
- Perceived quality of original model can be reduced if a lot of downstream issues

❌ Additional Layers of Technical Debt

- Sub-optimal downstream models





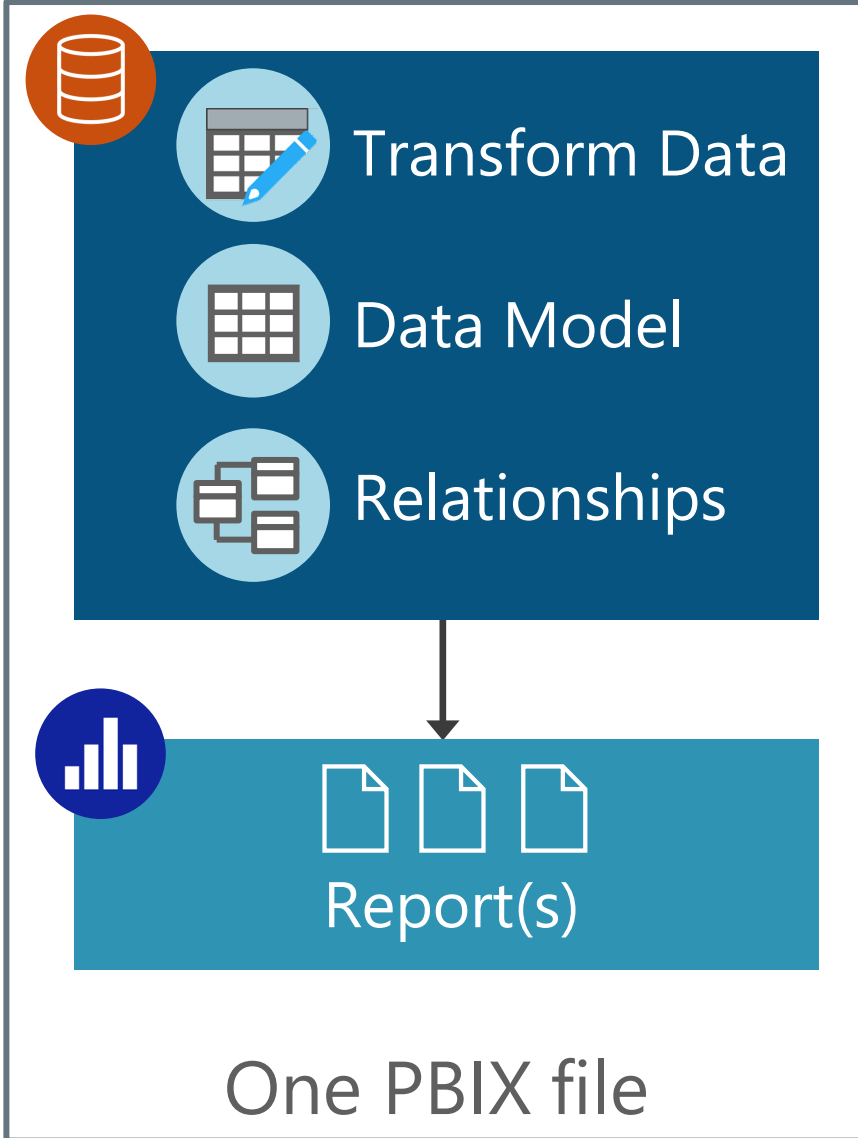
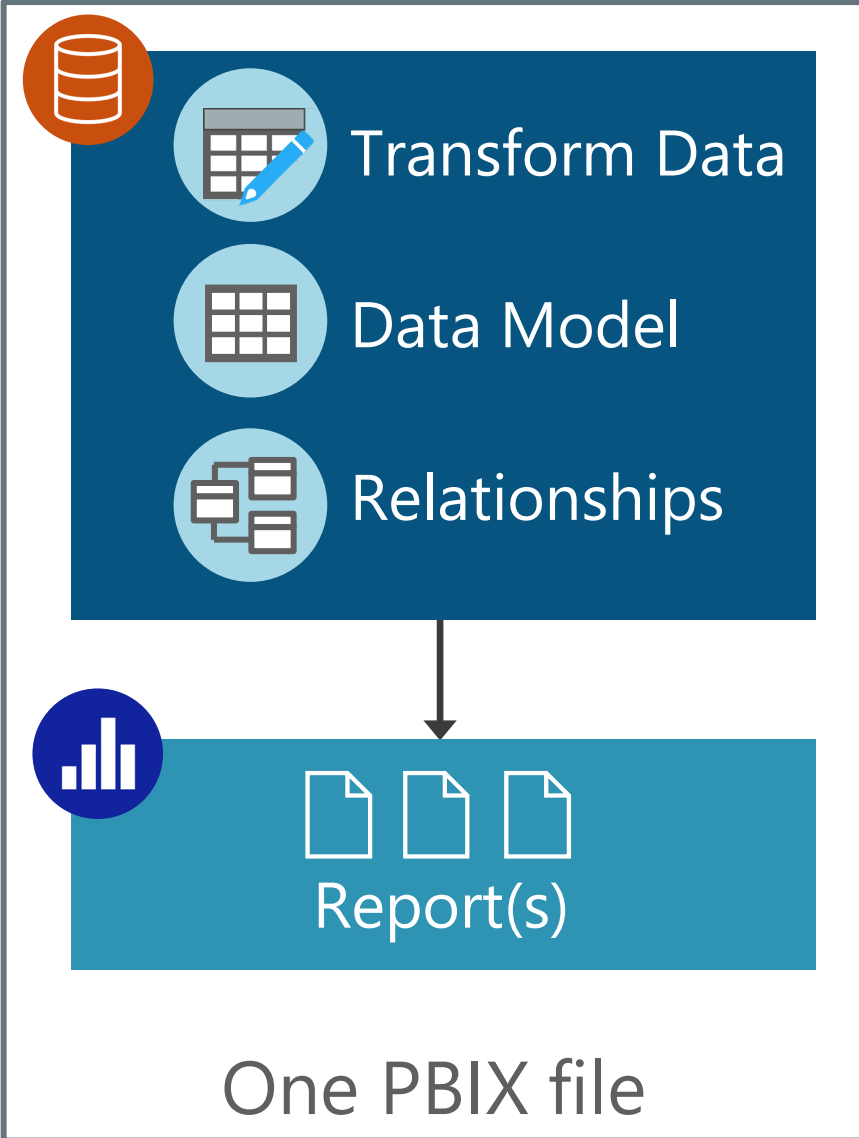
Dataflows

Achieving Data Preparation Reuse in Power BI

What if There's a Lot of Data Preparation?



Dataset:



← Power Query:
Query Editor



Decoupling Data Preparation from the Model

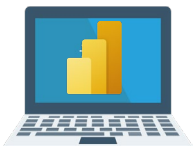
Dataflows are intended for reuse of data preparation across datasets



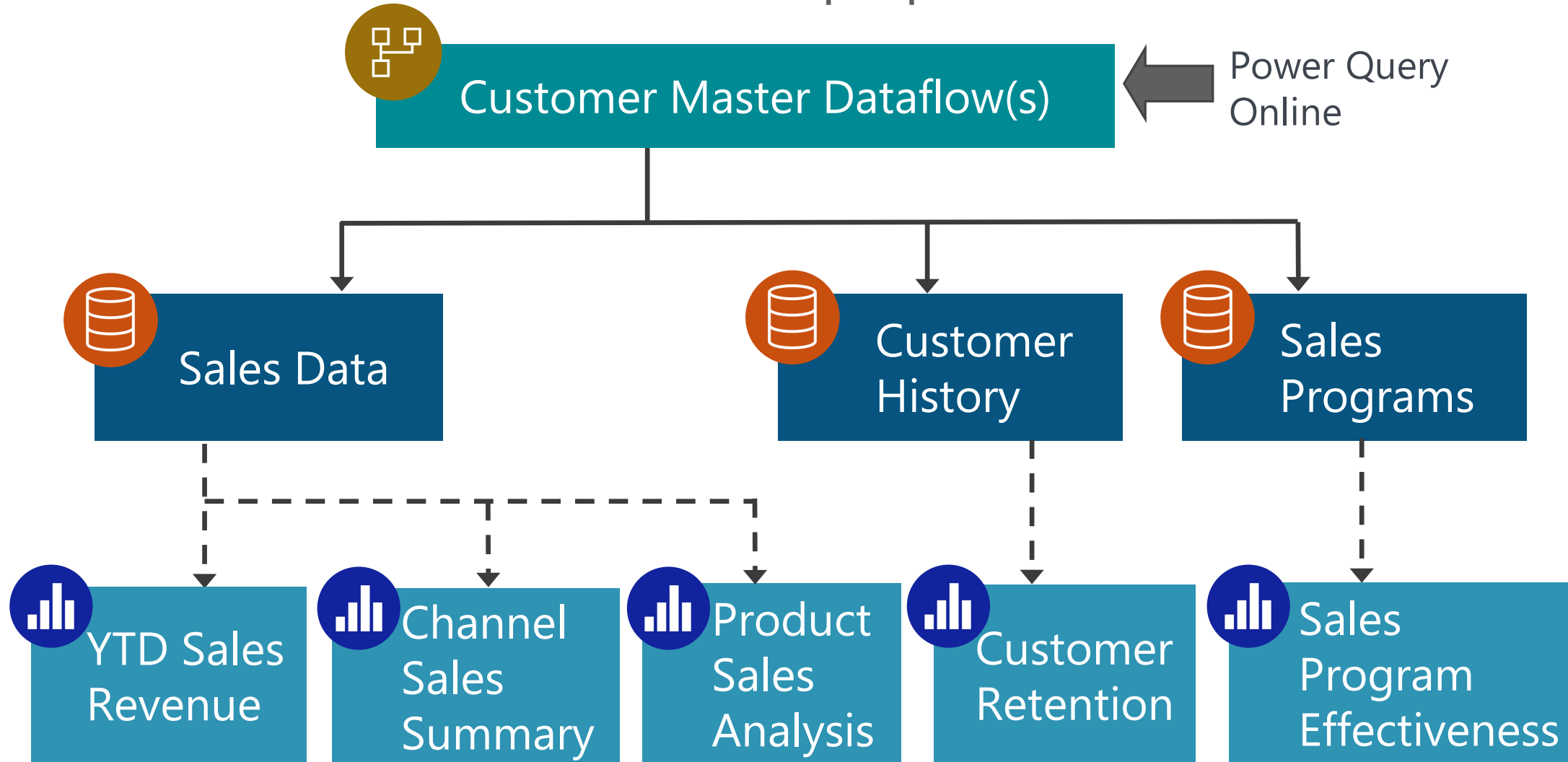
Dataflow:



Shared Datasets:

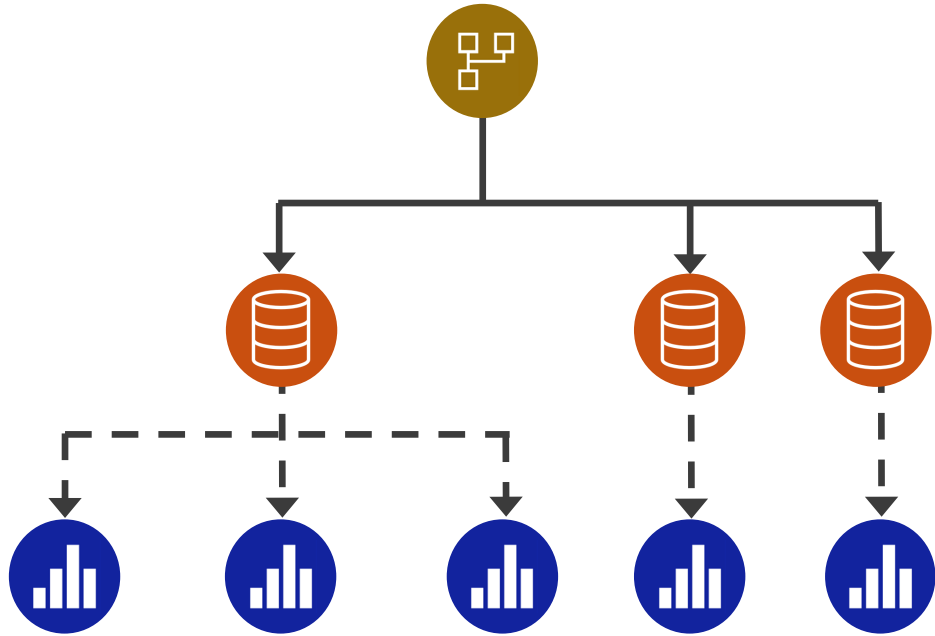


Reports:





Key Advantages of Dataflows

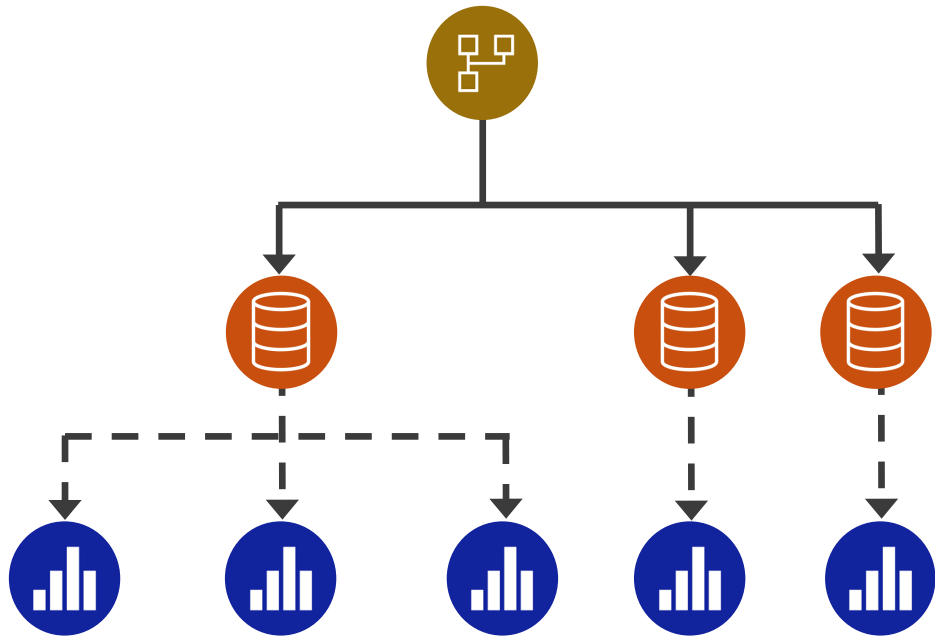


☑ Self-Service BI Enablement

- Different people can handle data preparation vs. data modeling vs. report creation
- Shields dataset authors from complex source systems
- Reduced effort for dataset authors because data is staged/pre-processed



Key Advantages of Dataflows

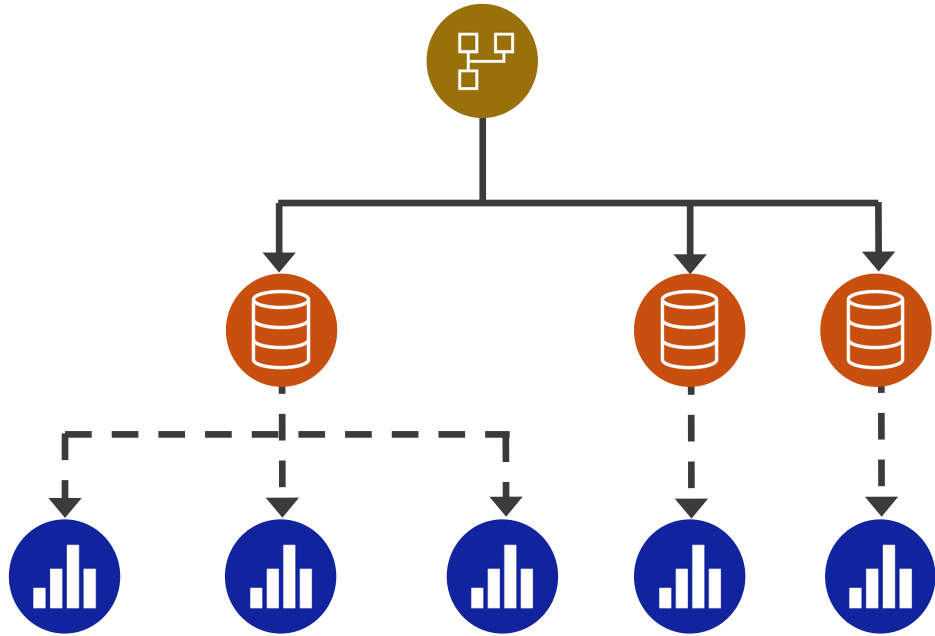


Follows the Fabric model

- Dataflows Gen 2 are one option for accessing, preparing, and loading data into OneLake *(not shown in the image)*



Key Advantages of Dataflows



Reusability of Common Data

Dimensional data

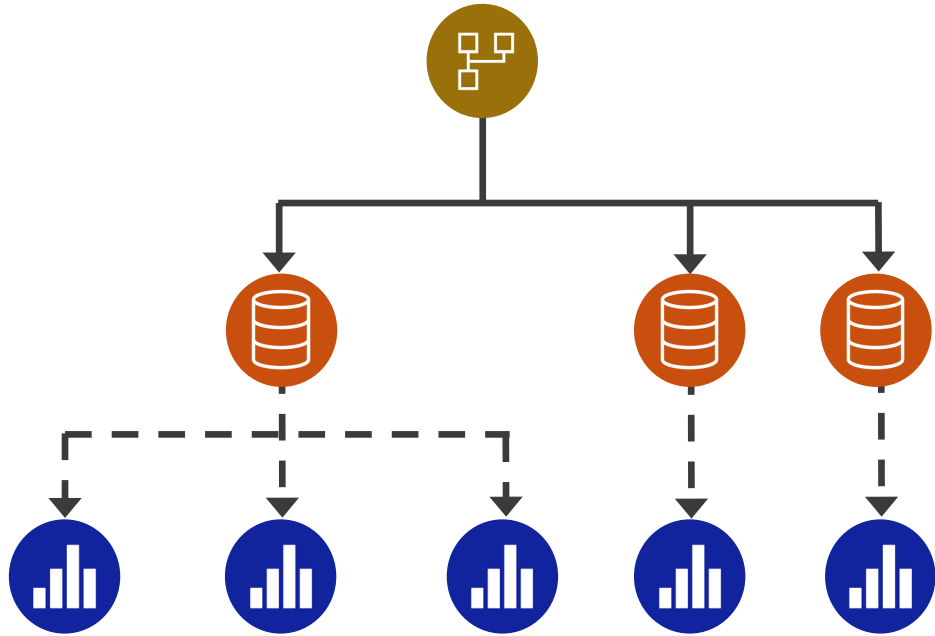
- Date
- Region
- Customer
- Product

Subject areas useful to many teams
(ex: annual budgets)

Standard security mappings
(ex: for row-level security)



Key Advantages of Dataflows

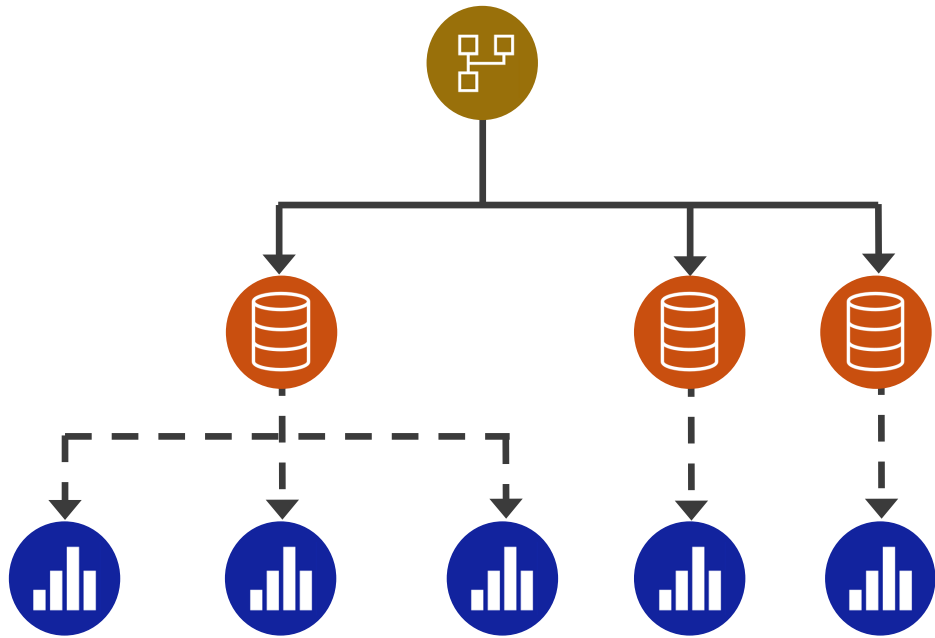


☑ Fewer Queries to Source Systems

- Reduced load on source systems during data refresh
- Fewer dataset authors need direct access or permissions to access source systems



Key Advantages of Dataflows



Improved Consistency

Usability is improved when consistency is a priority for:

- Friendly table & column names
- Data types
- Calculated columns
- Removal of unneeded columns



OneLake

A centralized data storage location



DirectLake

Accessing data from Power BI directly in OneLake without data refreshes or duplicating the data again



Reducing Copies of Data with OneLake

Ultimate goal: a single storage location for all Fabric workloads



OneLake



Data Engineering Workload



Sales Lakehouse:

- Folders
- Parquet Files
- Delta Tables



DW Workload



Sales Data Warehouse



Power BI Workload



Sales Data Dataset



YTD Sales Revenue Report

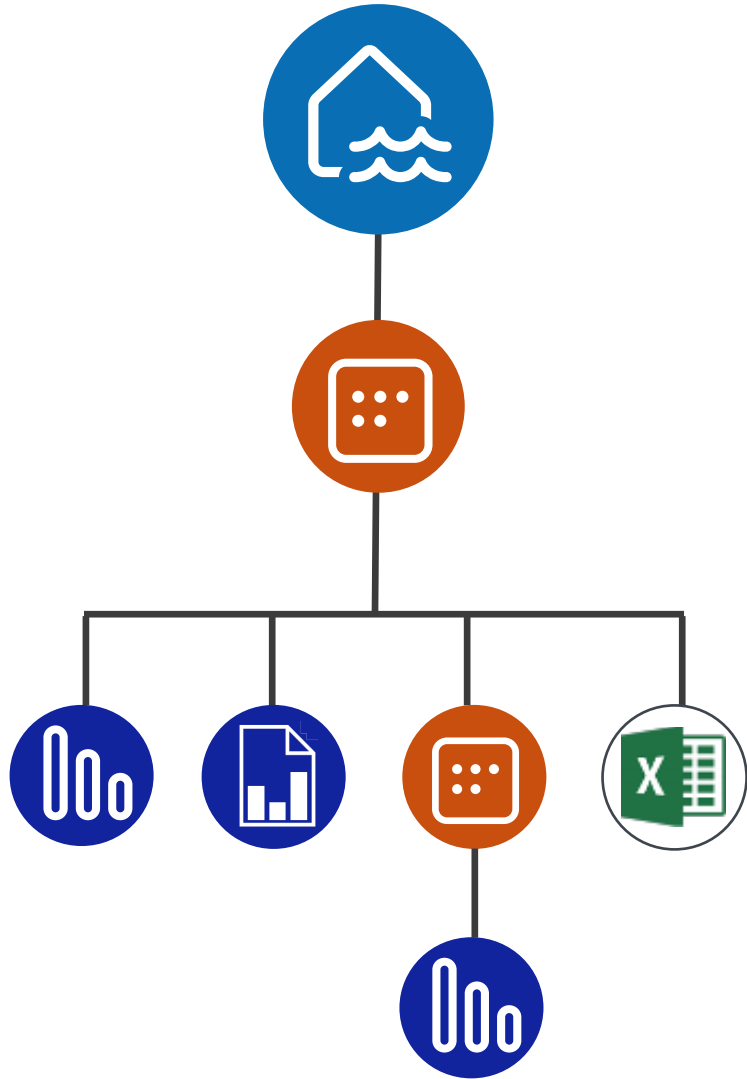


Channel Sales Report

Additional Fabric workloads not shown



Key Advantages of Using OneLake

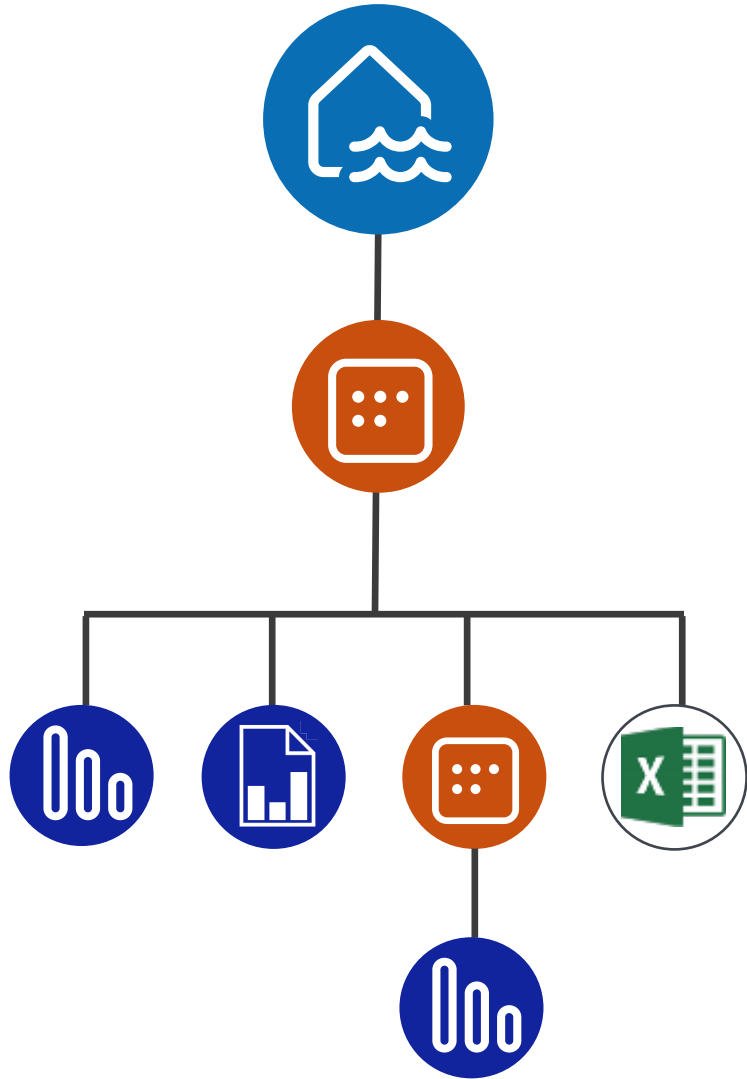


Governance

- All Fabric workloads will end up using OneLake as its default data location ("the OneDrive for data")
- Data storage can be centrally managed, audited, monitored, secured
- Less data proliferation and fewer data silos leads to reduced governance concerns



Key Advantages of Using OneLake

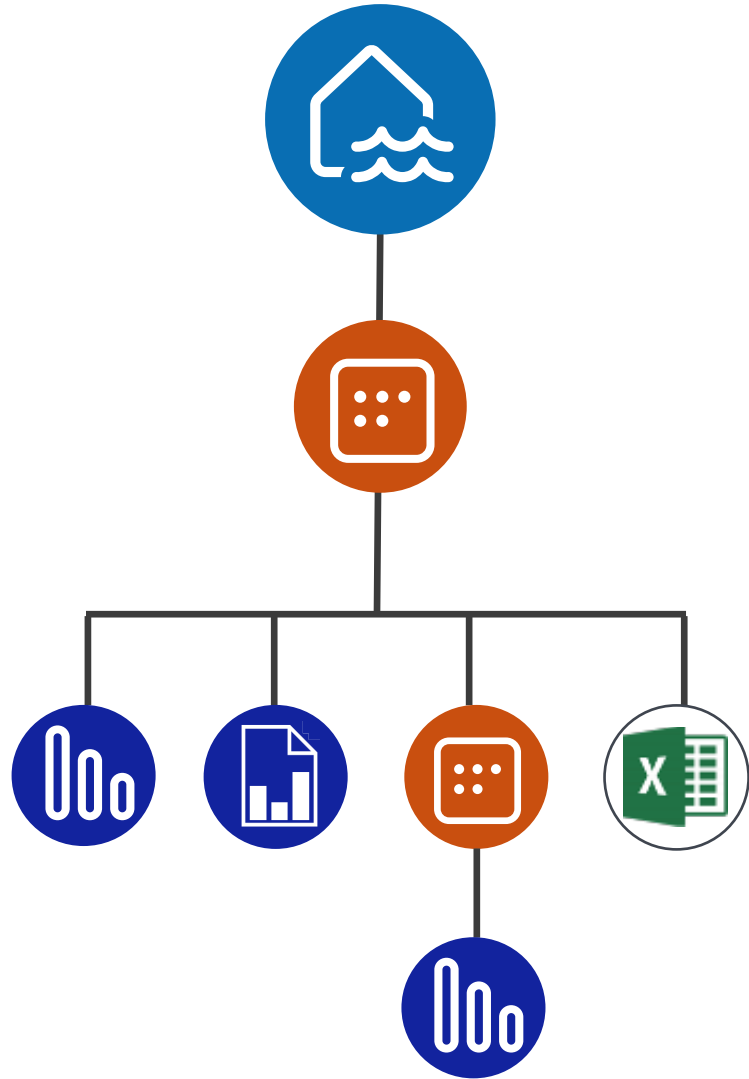


☑ Fewer 'copies' of the data

- OneLake has the data and we don't have to copy it again into a Power BI dataset
- Far less data integration work
- Many types of artifacts can reuse the same data in OneLake – not just Power BI (ex: Data Warehouse uses a SQL endpoint)



Key Advantages of Using OneLake



User enablement

- Makes it easier for users to work with data in the right ways (within your governance guardrails and with administrator visibility)
- Data can (optionally) be 'discoverable' through the OneLake Data Hub



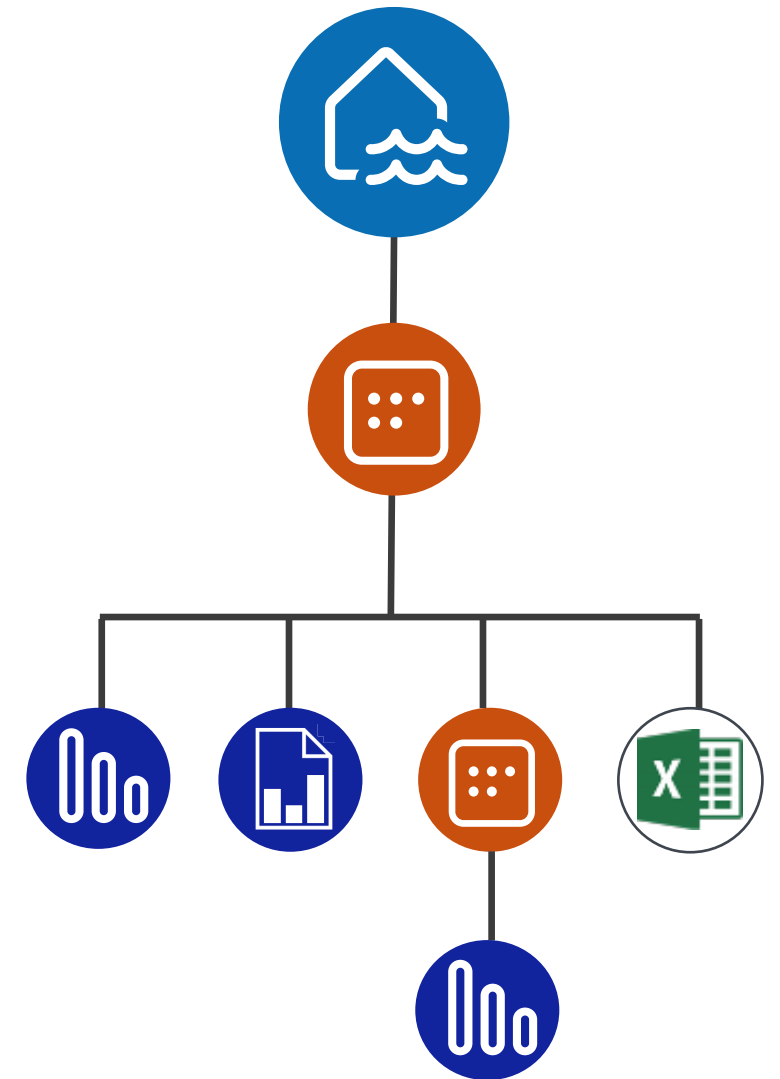
Possible Disadvantages of Using OneLake

❌ Greater dependencies

- Additional risk if the data isn't well managed with proper change control (organizational readiness concerns)

❌ Ownership & responsibility

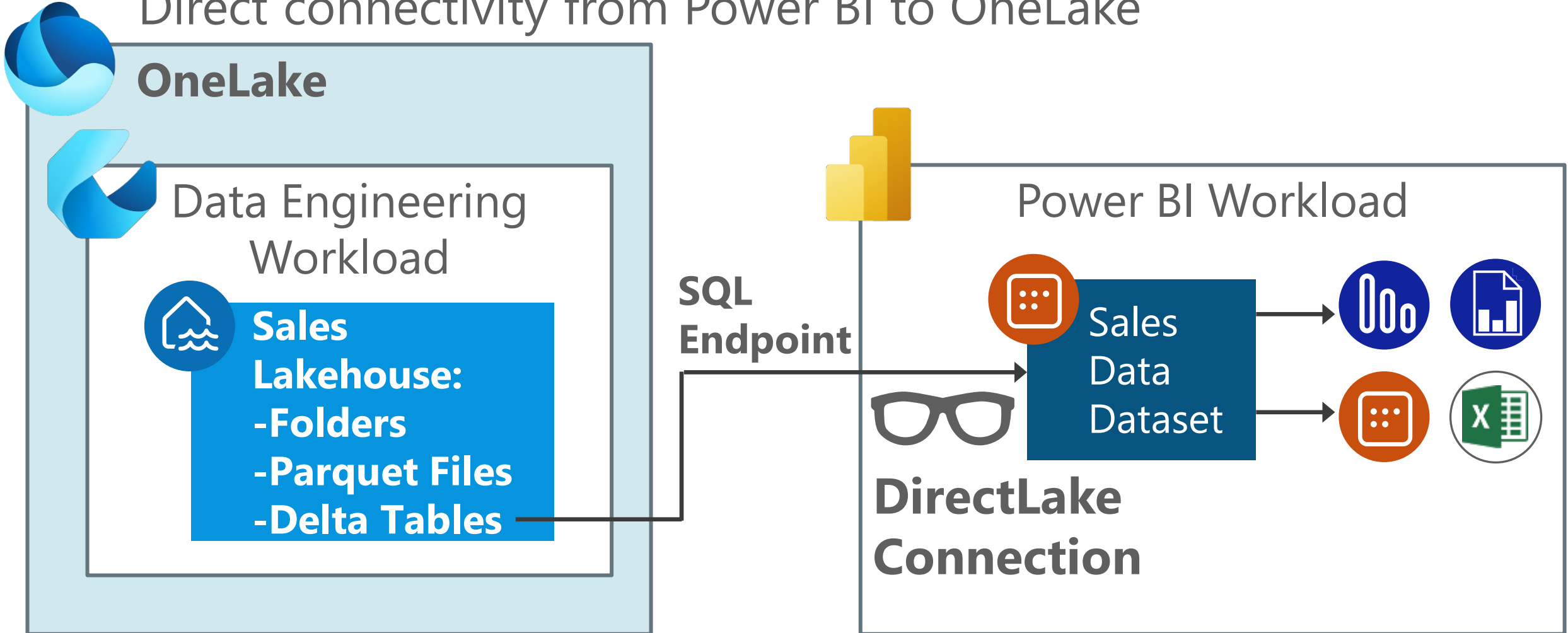
- Maintaining the lakehouse might be managed by another team (separate from Power BI creators) who have different skills (ex: Spark) and different priorities (people & process considerations)





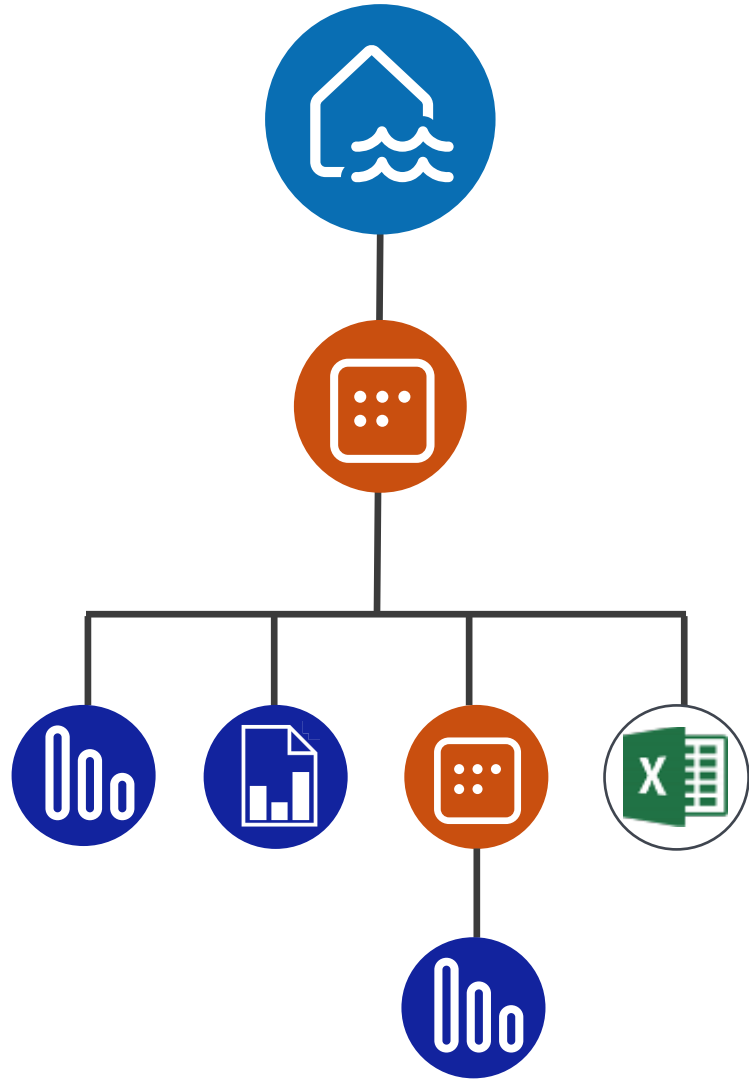
Accessing OneLake with DirectLake

Direct connectivity from Power BI to OneLake





Key Advantages of DirectLake in Power BI



☑ **Best of both worlds**

Goal is for reports to be able to access Power BI datasets:

- With the speed of *import mode* (because the data is in memory)
- With less data latency like *DirectQuery mode* (without tons of queries to the source)
- So we don't need to duplicate data
- We don't need to schedule refresh



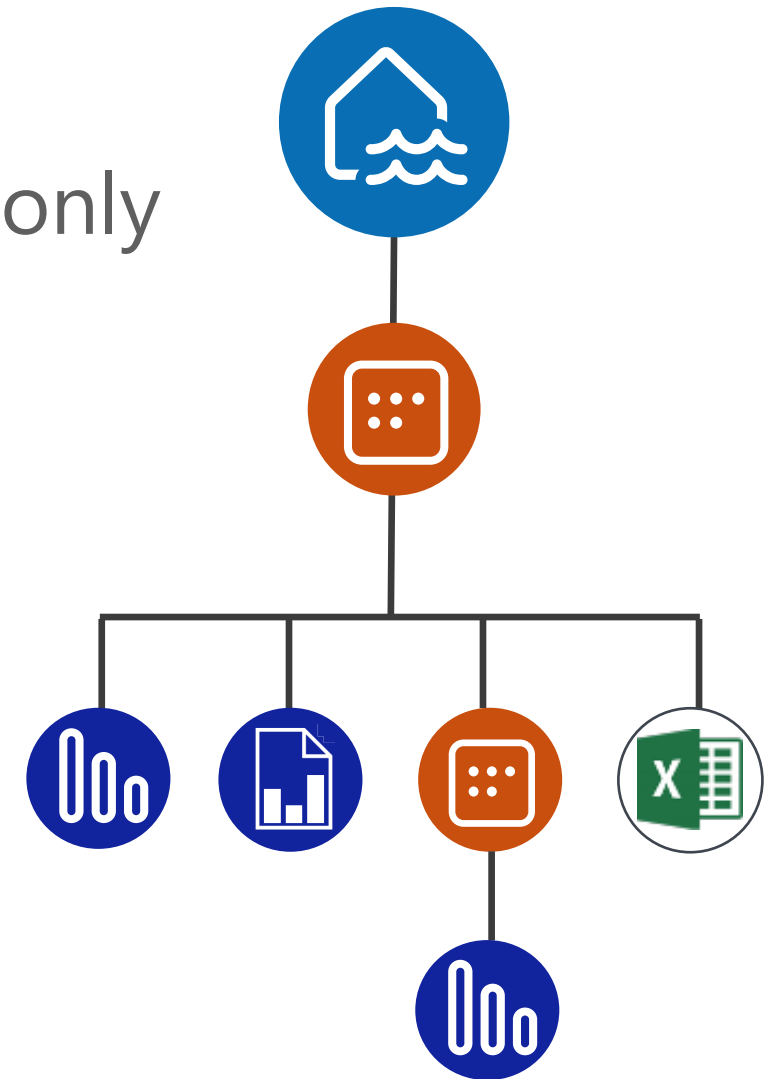
Things to Know About Using DirectLake

☑ Two types of datasets

- Decide if you'll use the 'default' read-only dataset or a 'custom' dataset

☑ Technical limitations

- Requires Delta tables
- Not everything is supported; sometimes it might revert to DirectQuery mode





Workspace Design

Advantages of separating 'data'
and 'reporting' workspaces



How to Organize Content in Workspaces?



**Data
workspace**



Sales Data



**Report
workspace**



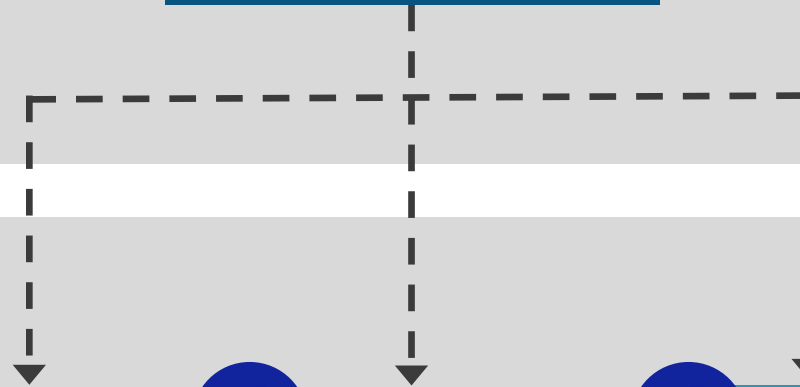
**YTD Sales
Revenue**



**Channel
Sales
Summary**

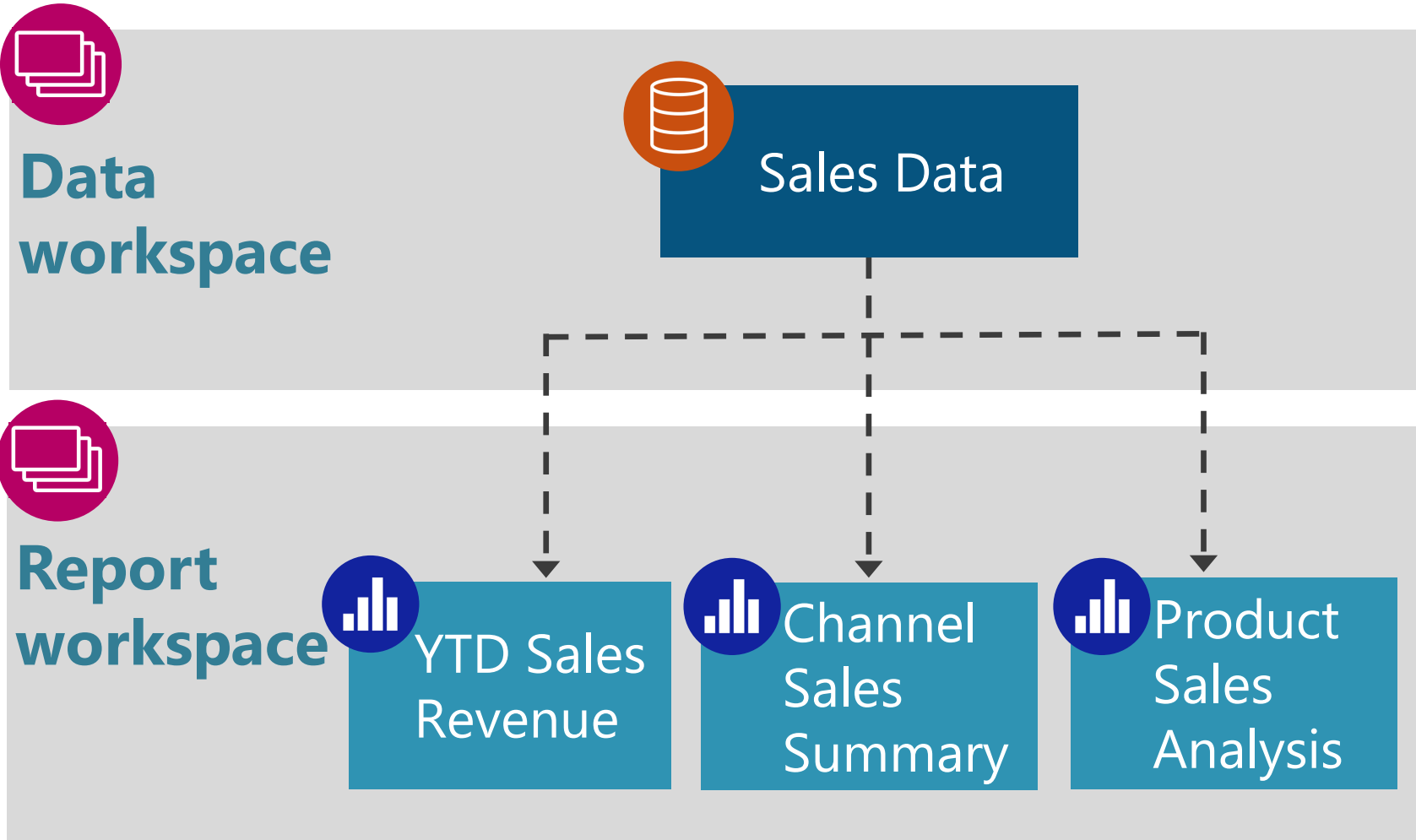


**Product
Sales
Analysis**





Assigning Permissions

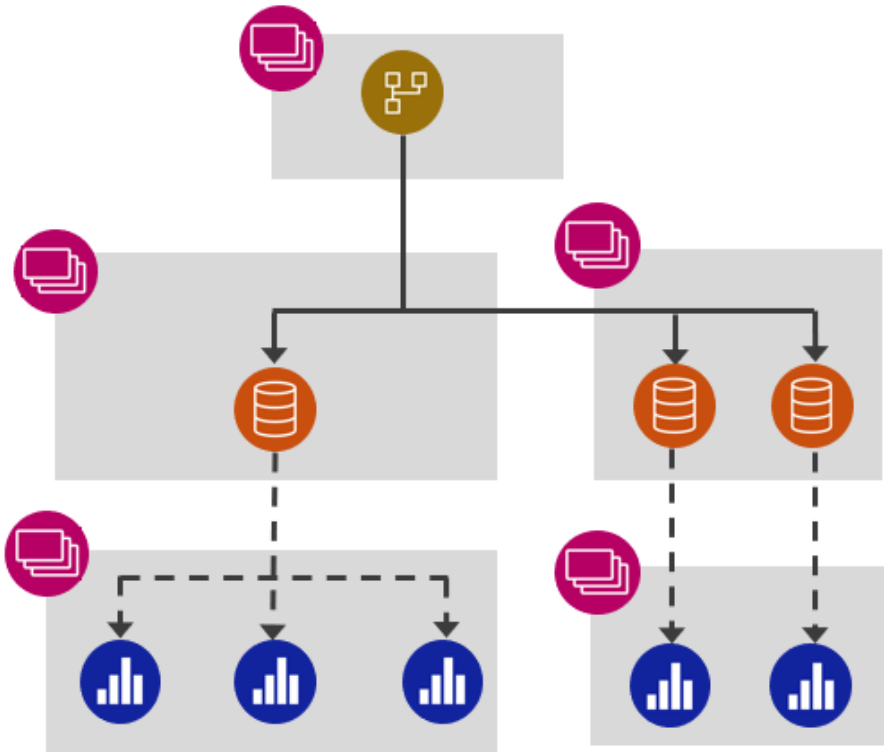


BI, IT, COE, data authors
Workspace role



Report authors
Workspace role
AND
Build on the dataset

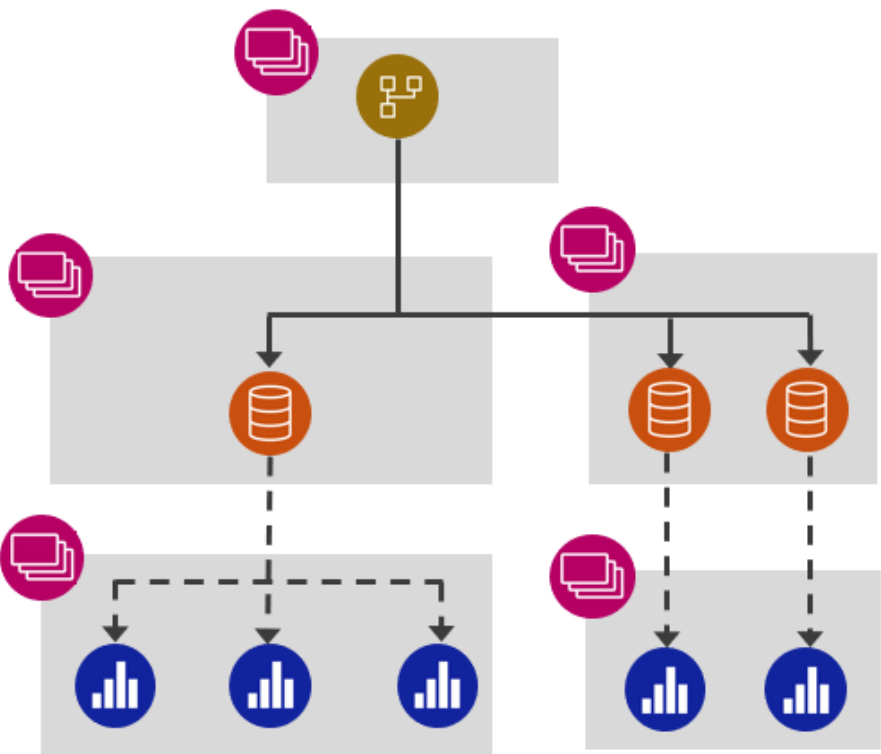
Key Advantages of Data vs. Report Workspaces



☑ Clear Ownership & Responsibilities

- Clarity on who owns & manages different content
- Separate access control (edit vs. view workspace roles)
- Enables distributed ownership and cross-team collaboration

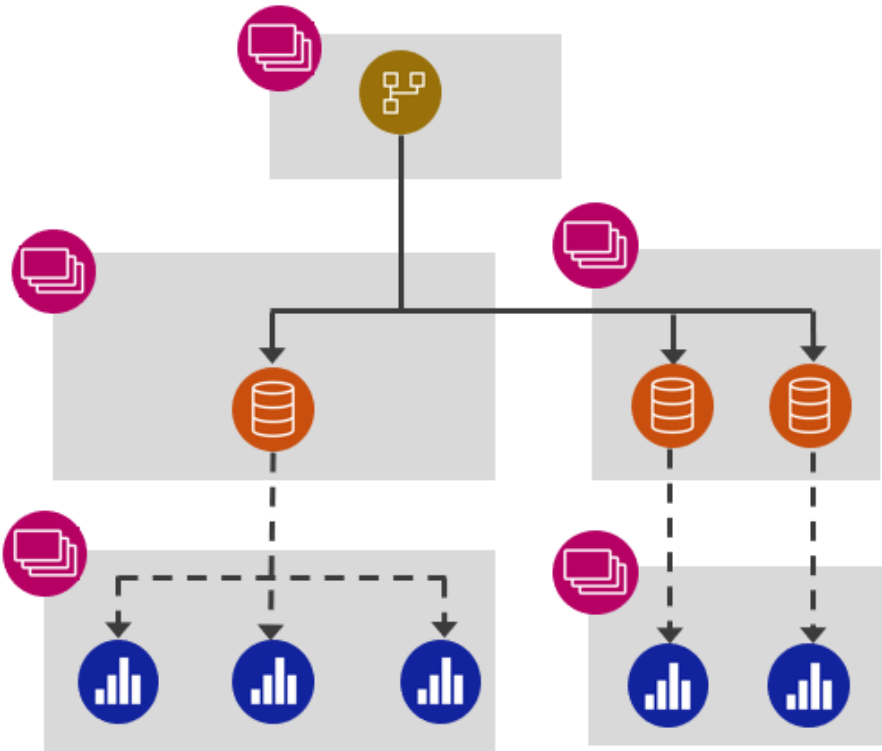
Key Advantages of Data vs. Report Workspaces



☑ Simplify for Report Creators

- Fabric creates a lot of data artifacts, so it's even more important to shield report creators from seeing a ton of items that they don't need to see in a workspace *(not shown in image)*

Key Advantages of Data vs. Report Workspaces



Security

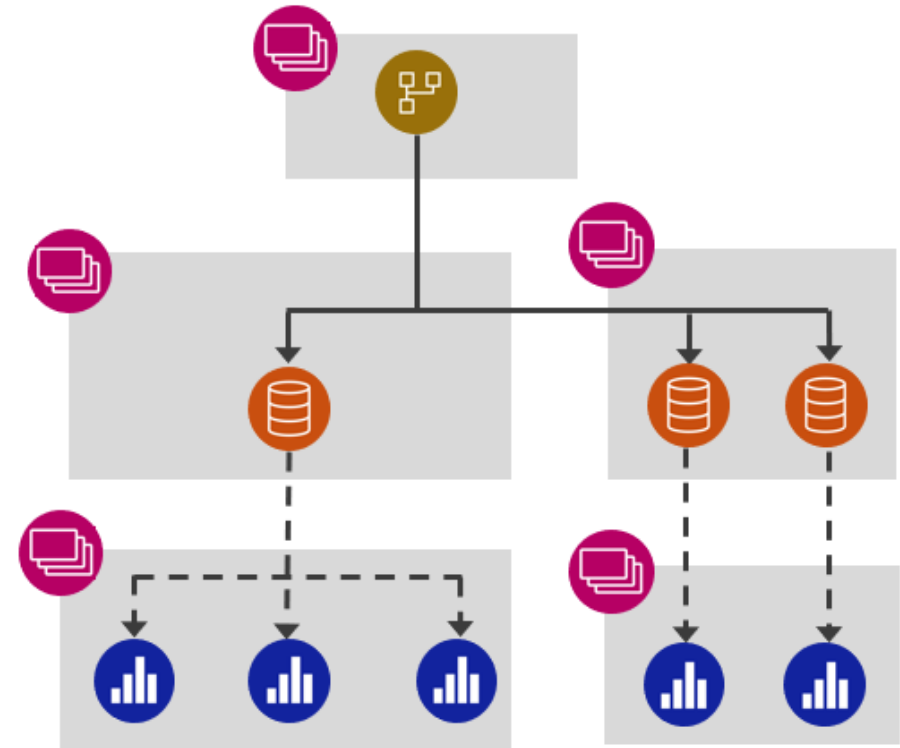
- Assign the 'build' permission on the dataset to allow certain people to build their own reports
- Row-level security works (!) for report authors who only have 'read' and/or 'build' permissions on the dataset

Key Disadvantages of Data vs. Report Workspaces



✘ Additional Workspaces

- More workspaces for admins to manage & monitor
- More workspaces for users to navigate





Endorsing Content

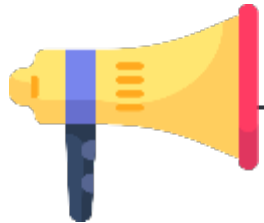


Two Types of Endorsements



Certified

The author wants to **signify the content is trustworthy**



Promoted

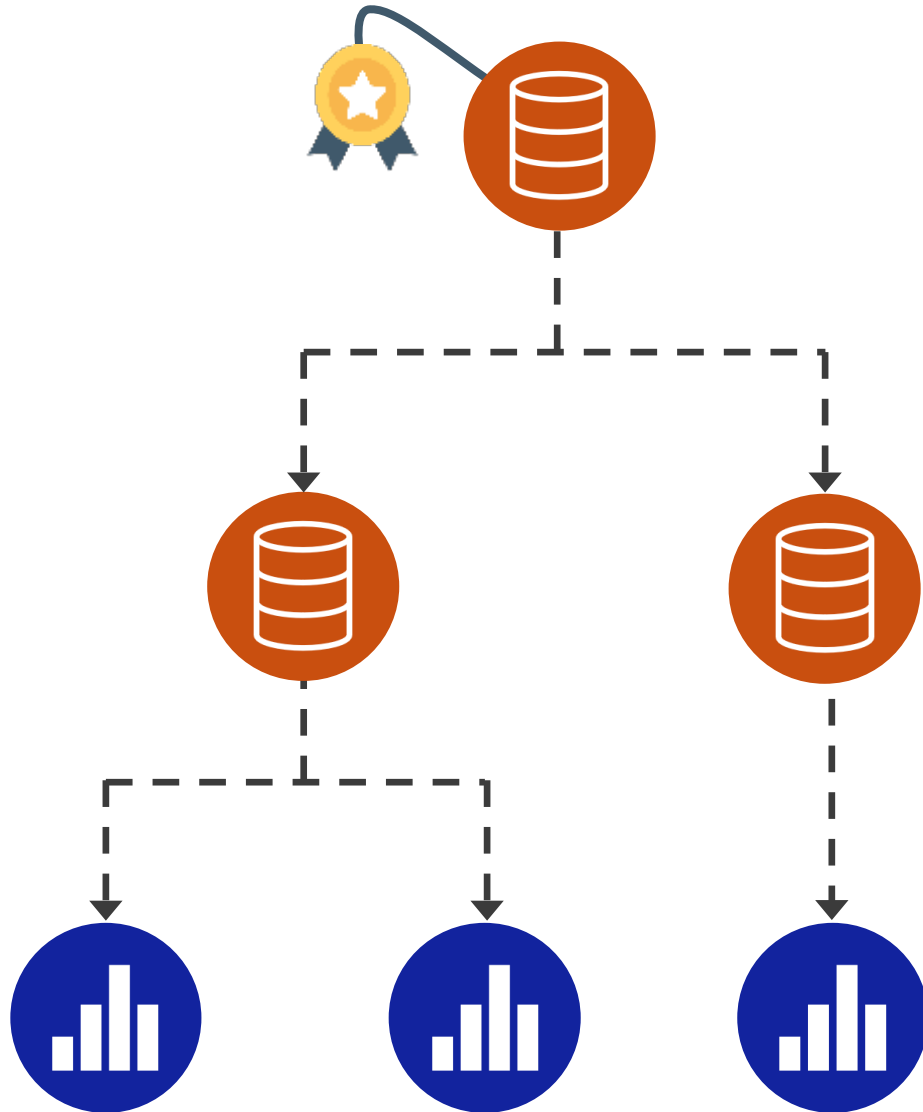
The author wants to **amplify that the content is available**



For more info: CoatesDS.com/blog/power-bi-certification



What Should Be Certified?



As we encourage data reuse, we want to let other users know how trustworthy the content is.






What Can Be Endorsed?

Data:

-  Dataset
-  Dataflow
-  Datamart
-  Lakehouse

Reports:

-  Power BI Report
-  Paginated Report
-  Scorecard

Set of Reports & Dashboards:

-  App

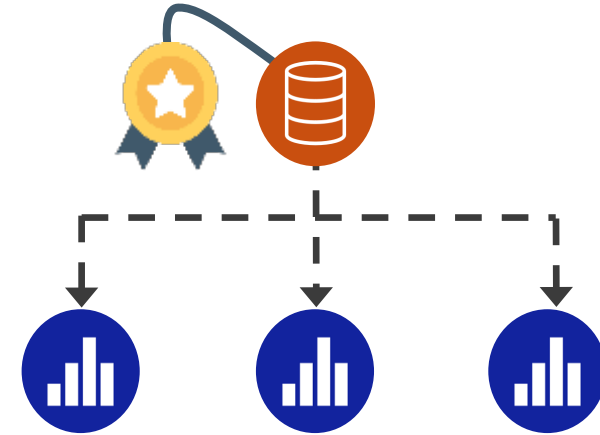
Not supported (yet?):
Warehouse, SQL Endpoint,
Dashboards, Workbooks,
Workspaces



The Meaning of 'Data' Certification

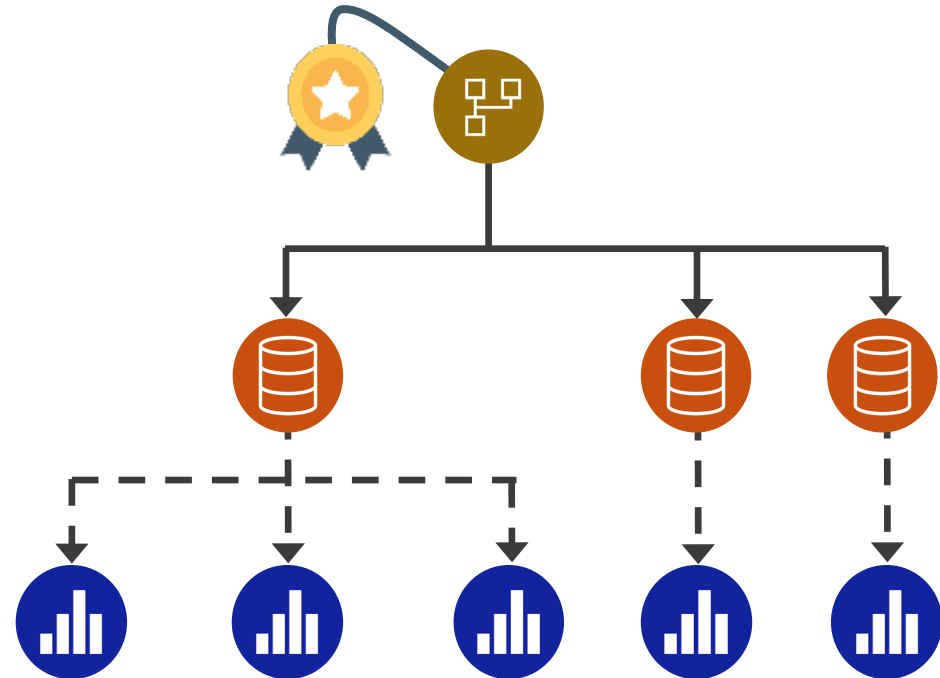
Certified dataset:

Report authors accept a dependency and **trust** the dataset as a source for building their own reports.



Certified dataflow:

Dataset authors accept a dependency and **trust** the dataflow as a source for creating their own datasets.





The Meaning of 'Report' Certification



Certified report:

Consumers of the report **trust** the data to **make business decisions** based on it.



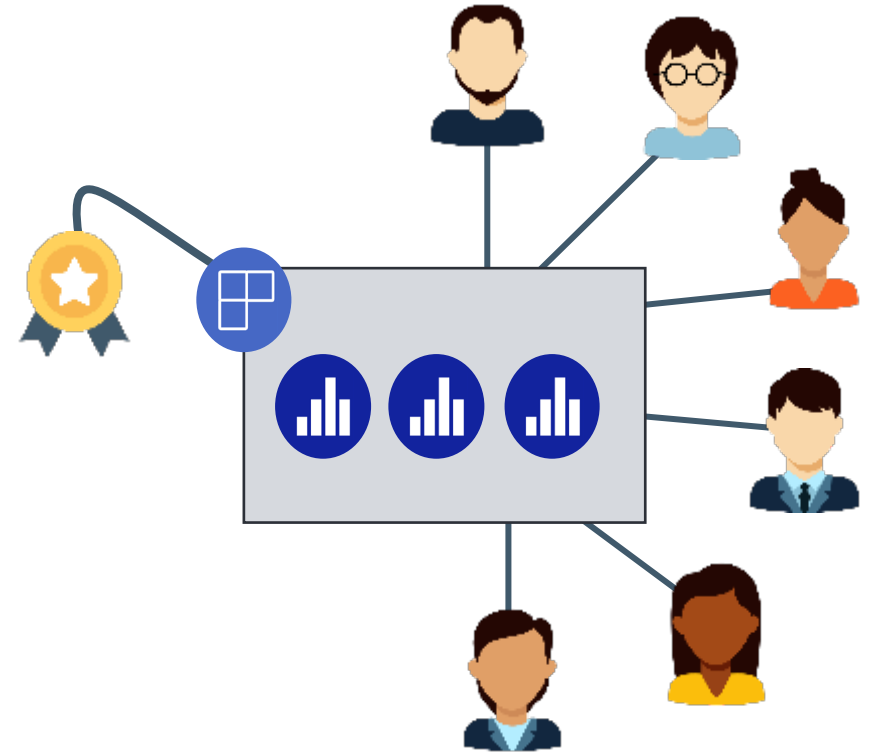


The Meaning of 'App' Certification



Certified app:

Consumers of the app trust ****all**** of the reports within the app to make business decisions.





Process to Certify Content



Ensure the process to **endorse content** is meaningful and consistently applied. At a minimum, include:

- Data source & lineage review
- Data model tech review
- Report/visualization review
- Security review
- Data accuracy validation
- Documentation review



More info:

<https://docs.microsoft.com/en-us/power-bi/collaborate-share/service-endorsement-overview>



Discovering Trustworthy Content



Finding Trustworthy Content

Why make your endorsed data **discoverable**?

- Help people understand the data exists
- Reduce potential for duplicate effort
- Increase investment in existing data assets
- Allow people to request access to the data



More info: <https://docs.microsoft.com/en-us/power-bi/collaborate-share/service-discovery>
<https://docs.microsoft.com/en-us/power-bi/connect-data/service-datasets-hub>



OneLake Data Hub

Targeted primarily to content creators (rather than consumers) because it displays 'data' items only:

- Datasets
- Dataflows
- Datamarts
- Lakehouses
- SQL Endpoints
- Warehouses
- KQL Databases

Standard search in Power BI relies on having existing permissions to the content, so search isn't the same as discovery



Sensitivity Labels & Usage Expectations



Sensitivity Labels

Why assign **sensitivity labels**?

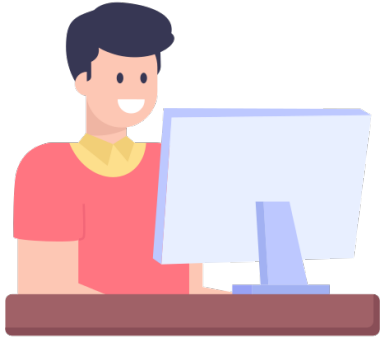
- Help people understand how sensitive or confidential it is so they understand ***what they can or can't do***
- Help people take responsible actions
- Assist with right-sizing user permissions
- Create automated data loss prevention policies



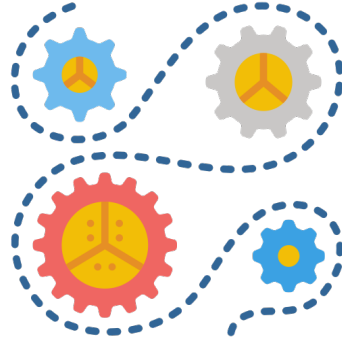
More info: <https://learn.microsoft.com/en-us/power-bi/guidance/powerbi-implementation-planning-info-protection-data-loss-prevention-overview>



Ways to Apply Sensitivity Labels



**Manually
applied by
a user**



**Auto-applied
programmatically**

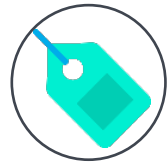


**Applied by a Power
BI administrator
with REST API**

Sensitivity Label Stays With the Content



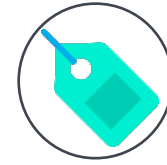
Power BI
Desktop
file
(.pbix)



Power BI Service
artifacts:

- Reports
- Datasets
- Dataflows
- Dashboards

Power BI mobile apps



Live connection, or
Analyze in Excel, or
Download PBIX file, or
Report/data exports to:
-Excel -PowerPoint
-PDF -Word



Q&A

More Information from Melissa Coates



Slides:

CoatesDS.com/Presentations



Diagrams:

CoatesDS.com/Diagrams



Power BI Governance Training:

CoatesDS.com/Training



Blog:

CoatesDS.com/Blog-Posts



YouTube:

YouTube.com/CoatesDataStrategies



APPENDIX:

Documenting, Testing, and Helping User Recognize Trustworthy Content



Documentation



Include **report documentation** to help both **consumers and creators**, such as:

- Purpose
- Target audience
- Business rules & calculation logic
- Definition of key performance indicators
- Data sources (lineage)
- Who to contact with questions

Change Log



Consider publishing a **change log** so consumers can easily see:

- What changes occurred
- When
- By whom



Artifact Properties



Set helpful **workspace & artifact properties**:

- Contact
- Description
- Sensitivity label
- Endorsement
- Discoverability
- Custom instructions for requesting access



Data Quality



Consider publishing a **data quality dashboard** so report consumers can verify:

- Data validation results
- Repeatable reconciliation process
- Authoritative data sources (lineage)

Consider including an easy way for report consumers to **submit a data issue** they see or ask questions.

How will you catch data quality issues before consumers do?

Testing Processes



Create a list of ***repeatable data quality unit tests*** such as:

- Row counts
- Totals
- Data meets certain expectations
- Good, maintainable, testable coding standards are used



Separate Environments



Safeguard the production content with:

- Development
- Test
- Production