

3CLOUD SOLUTIONS PRESENTS

# Moving informal Power BI projects to Enterprise Scale

Paul Turley

Principal Consultant,

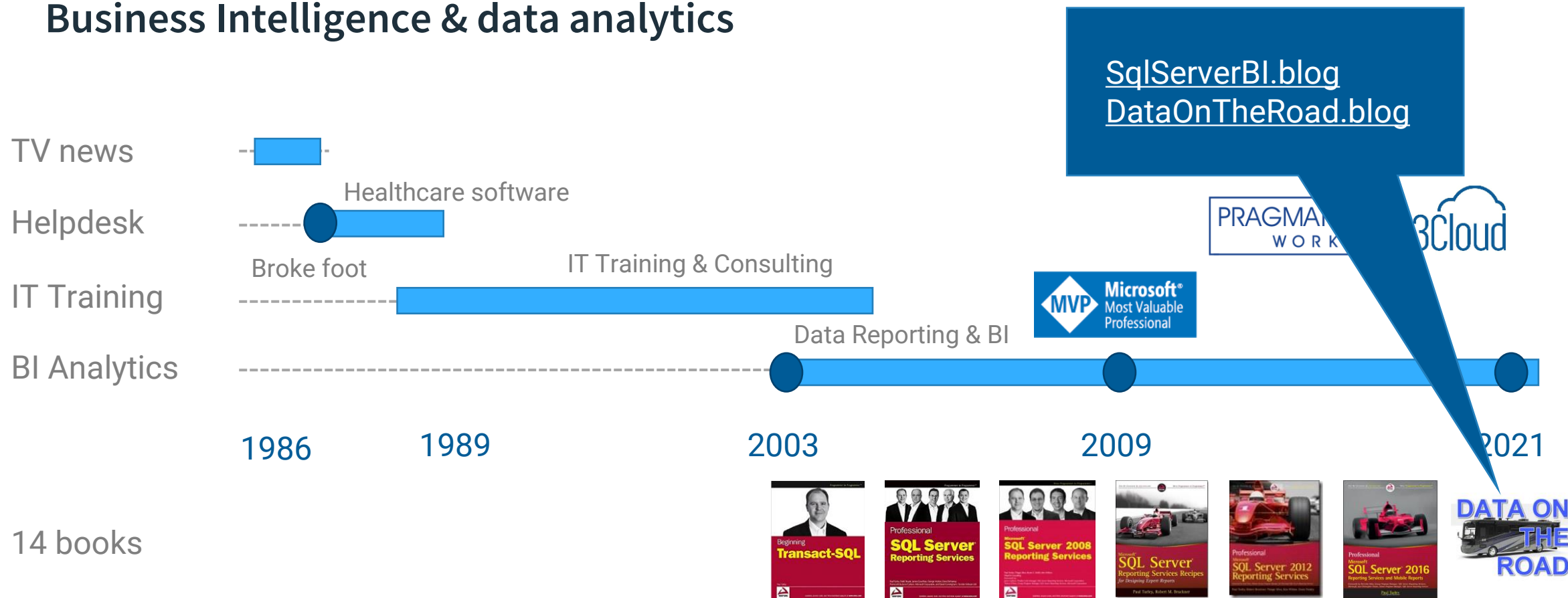
Microsoft Data Platform MVP | FastTrack Recognized Solution Architect

Learn how to transition quick, informal Power BI projects to formal, futureproof solutions.  
Plan for scale and larger data volumes.  
Develop according to best practice designs, support versioning and multi-developer project teams.  
Demonstrate techniques, share tips and design patterns from blog series: “Doing Power BI the Right Way”.

# Paul Turley

Principal Consultant, Microsoft Data Platform MVP

~25 years in IT, data platform,  
Business Intelligence & data analytics



# Agenda

Let's talk about  
what we're going to  
talk about

Enterprise-ready Power BI  
Self-service Power BI  
Audience  
Data Volume  
Architecture Patterns  
Power BI and Excel  
Certified & Shared Datasets  
Licensing Power BI for Scale  
Optimizing Queries for Scale  
Optimizing Models for Scale  
Optimizing Reports for Scale  
Planning for Separation  
Planning for the Future

# Is Power BI Enterprise Ready?

- ✓ Large-scale Data
- ✓ Broad user support
- ✓ Team Development & Collaboration
- ✓ Data Governance Policies
- ✓ Data Management Policies
- ✓ Lifecycle & Deployment
- ✓ Versioning
- ✓ Embedding & Integration
- ✓ Automation
- ✓ Administration
- ✓ Security:
  - User Access & Data Protection
  - Role-based & User-based filtering

[White papers for Power BI - Power BI | Microsoft Docs:](https://docs.microsoft.com/en-us/power-bi/guidance/whitepapers)

<https://docs.microsoft.com/en-us/power-bi/guidance/whitepapers>



# Typical Power BI Use Cases

- Ad hoc analysis
- Quick reporting
- Transformation & shaping as-you-go
- Data model evolution
- Visualize: try-and-see
- Standards? Who needs standards?
  - Naming conventions
  - Modeling & relationships
  - Measure logic
  - Documentation
  - Version control



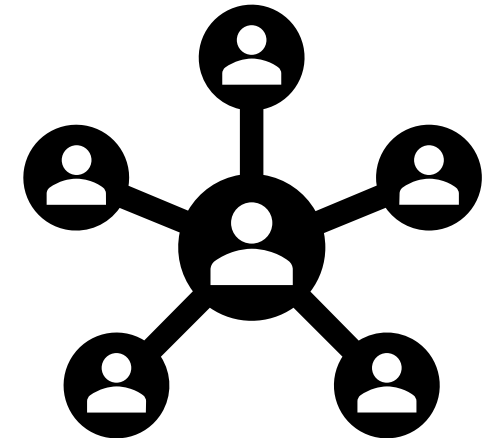
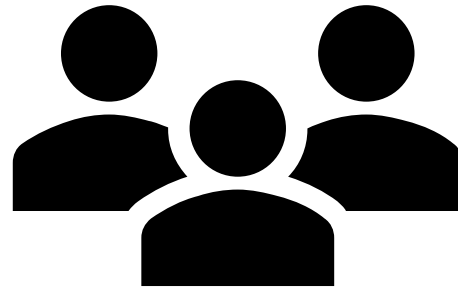
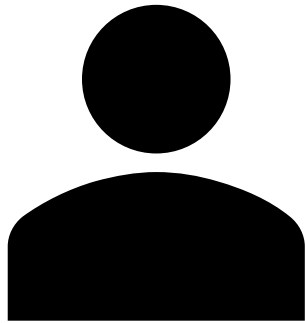
## Audience, Size & Scale

One size doesn't always fit all

With planning, informal projects can be adapted to meet enterprise needs

Know when to keep and update a design

Know when to toss a design and start over





## Iterative Design













- Define solution scope
- Work in iterative cycles
- Evaluate design
- Keep what works
- Discard what doesn't
- Learn & improve
- Evaluate to solution scope





# Decision Criteria

What components of the solution have “good bones”?

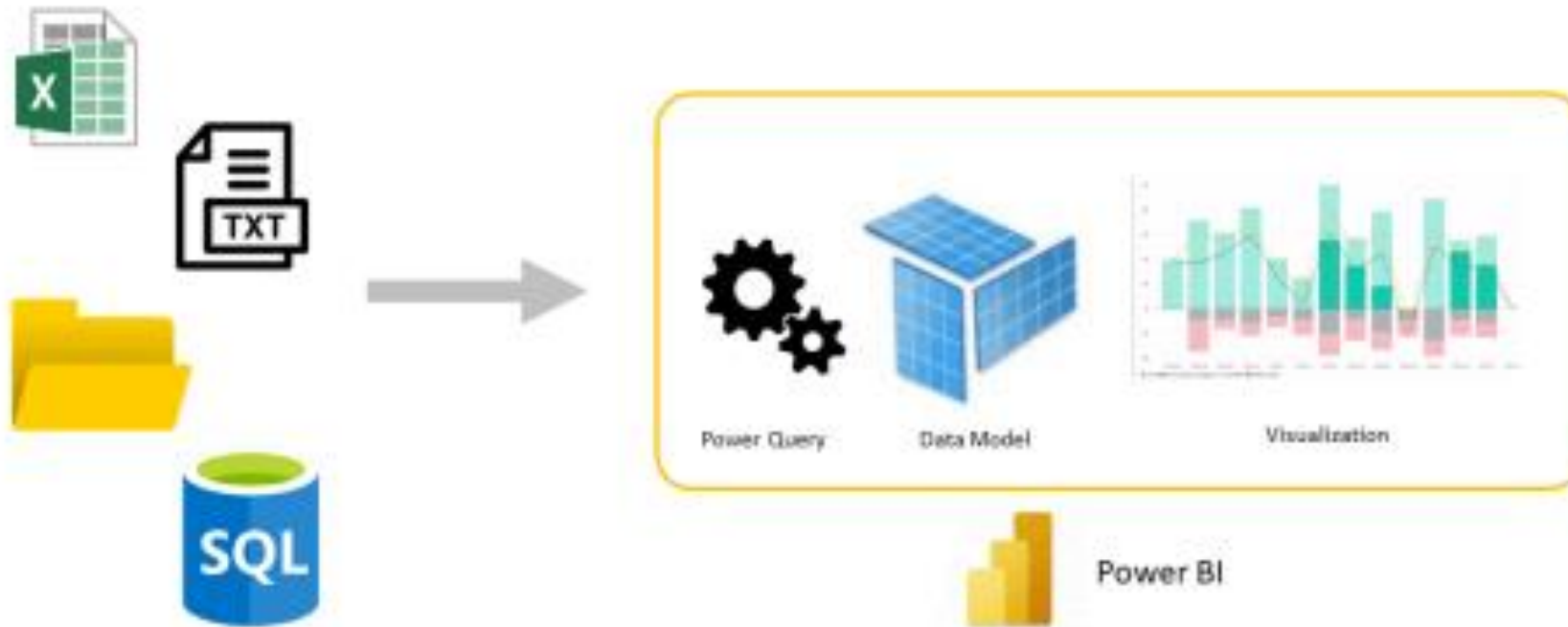
<b>Data Source Objects</b>	Files, queries, tables, views		
<b>Transformation Choice</b>	ELT or ETL, SQL queries, Power Query (does it scale?)		
<b>Data Model Design</b>	Flat tables, star schema, bridges & complex relationships		
<b>Development Standards</b>	Naming conventions, Traceable table & column references		
<b>Deployment Method</b>	Manual, Power BI Desktop, Visual Studio or Tabular Editor, Scripted, Automated		
<b>Report Delivery Method</b>	Web portal, Mobile, Publish to web, Embedded, Teams		

# Architecture Patterns

- Is the current solution:
- A good proof of concept to learn from?
- A solid foundation to build upon?



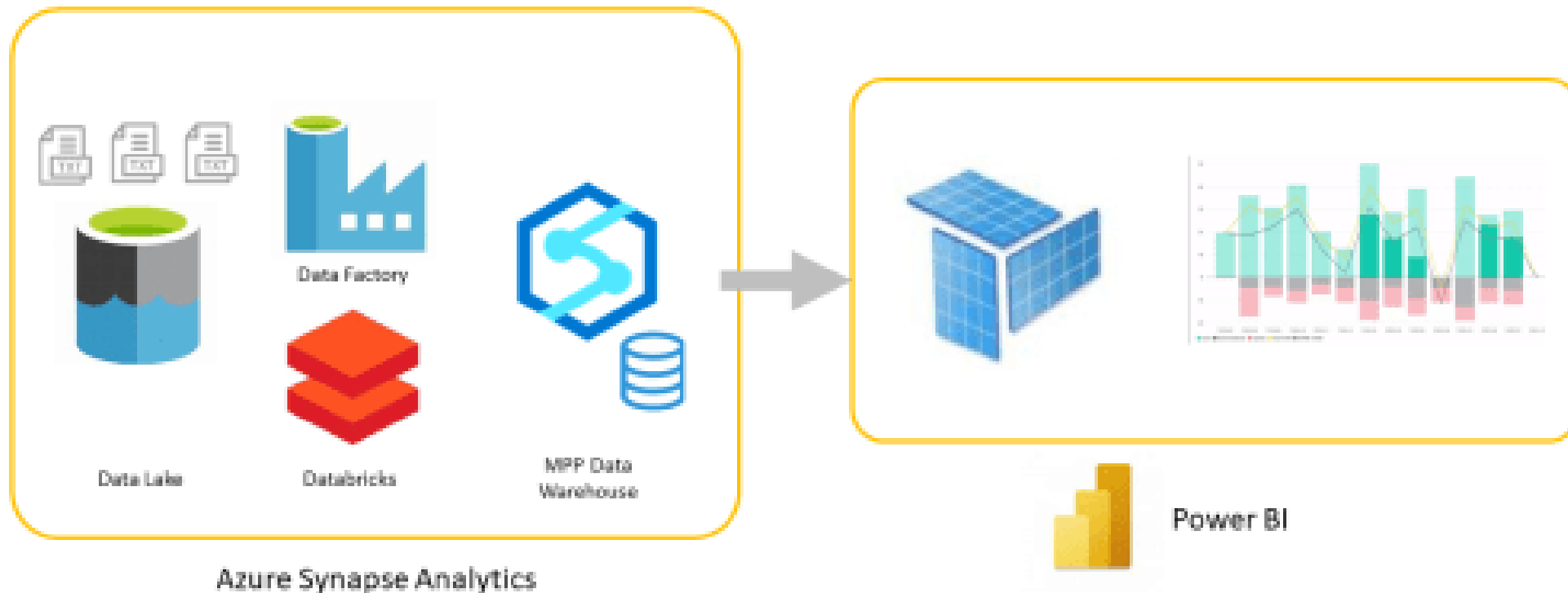
## Self-service Data Prep & Analysis



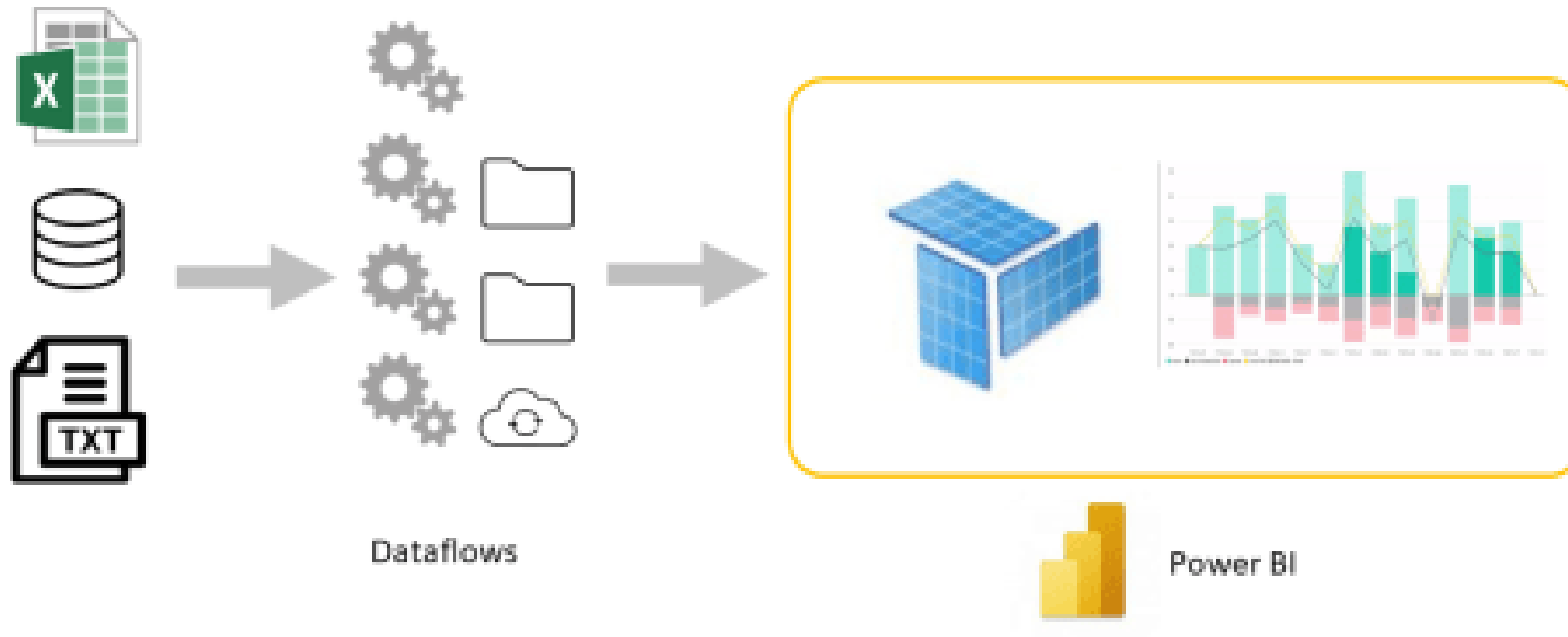
## Modern Data Warehouse



## Enterprise Modern Data Warehouse



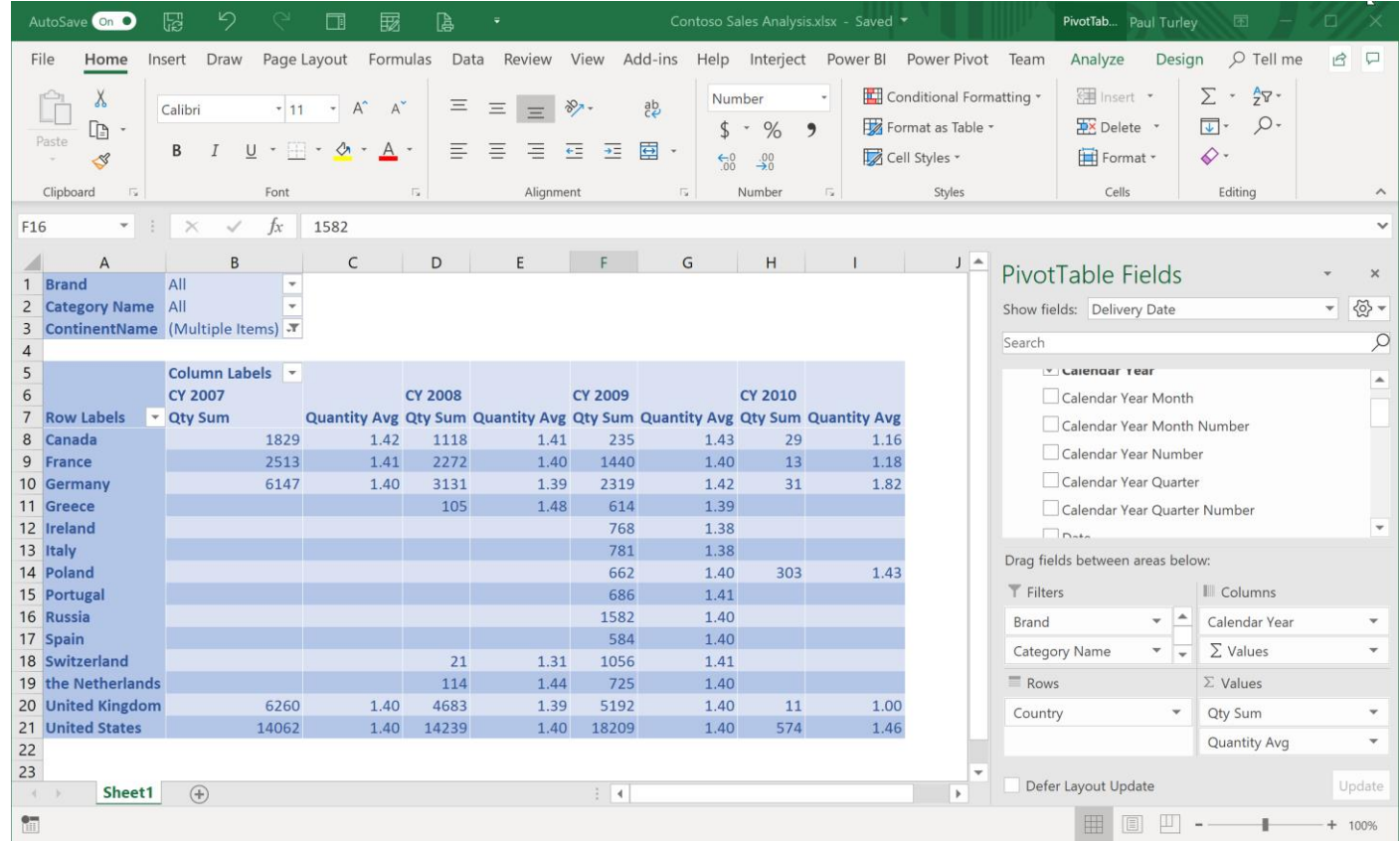
## Data Prep with Dataflows





# If Users Need Excel, Give them Excel

- Teach analyst users how to use Excel with Power BI
- Don't "export", ... "connect"
- **"Analyze In Excel"** allows Excel to connect, live, to a published Power BI dataset
- Now available to Power BI Pro & Free Premium licensed users
- Now available to "free" licensed users in a Premium



Contoso Sales Analysis.xlsx - Saved

File Home Insert Draw Page Layout Formulas Data Review View Add-ins Help Interject Power BI Power Pivot Team Analyze Design Tell me

Clipboard Font Alignment Number Styles Cells Editing

F16 1582

	Column Labels								
	CY 2007		CY 2008		CY 2009		CY 2010		
Row Labels	Qty Sum	Quantity Avg	Qty Sum	Quantity Avg	Qty Sum	Quantity Avg	Qty Sum	Quantity Avg	
Canada	1829	1.42	1118	1.41	235	1.43	29	1.16	
France	2513	1.41	2272	1.40	1440	1.40	13	1.18	
Germany	6147	1.40	3131	1.39	2319	1.42	31	1.82	
Greece			105	1.48	614	1.39			
Ireland					768	1.38			
Italy					781	1.38			
Poland					662	1.40	303	1.43	
Portugal					686	1.41			
Russia					1582	1.40			
Spain					584	1.40			
Switzerland			21	1.31	1056	1.41			
the Netherlands			114	1.44	725	1.40			
United Kingdom	6260	1.40	4683	1.39	5192	1.40	11	1.00	
United States	14062	1.40	14239	1.40	18209	1.40	574	1.46	

PivotTable Fields

Show fields: Delivery Date

Search

Calendar year

☐ Calendar Year Month

☐ Calendar Year Month Number

☐ Calendar Year Number

☐ Calendar Year Quarter

☐ Calendar Year Quarter Number

☐ Data

Drag fields between areas below:

Filters

Brand

Category Name

Columns

Calendar Year

Σ Values

Rows

Country

Qty Sum

Quantity Avg

Defer Layout Update

Update

Sheet1

100%



## DATA MODEL

- Separate data model PBIX from Report PBIX
- Migrate large-scale or enterprise data models to Model.BIM file
- Manage enterprise models in Tabular Editor or Visual Studio

## REPORT

- **Reality:** Integrating changes made to multiple PBIX files is difficult to manage and challenging to perform technically using current desktop tools. Even with differencing tools and effective version-control, just avoid multi-developer work on Power BI dataset files.
- Leverage Power BI's simplicity and don't over-engineer release management or version control. Until tooling exists to automate deployments, keep this as simple as possible.
- **File versions:**  
Store the dataset and report PBIX files separately using a version number postfix for the file name in the following the format: **Major.Minor.Revision**. For example:  
**Manufacturing Cost Analysis Dataset v1.5.3.PBIX**
- **Deployment Pipelines**

# Promote Self-service Reporting



## Non-governed Data

- Teach & support analyst users to use Power BI to acquire, mashup & model data
- “make mistakes, get messy”
  - Lilly Tomlin, Miss Frizzle
- Deploy to “user” designated workspaces
- User-authored solutions be used to prototype & pattern governed data models

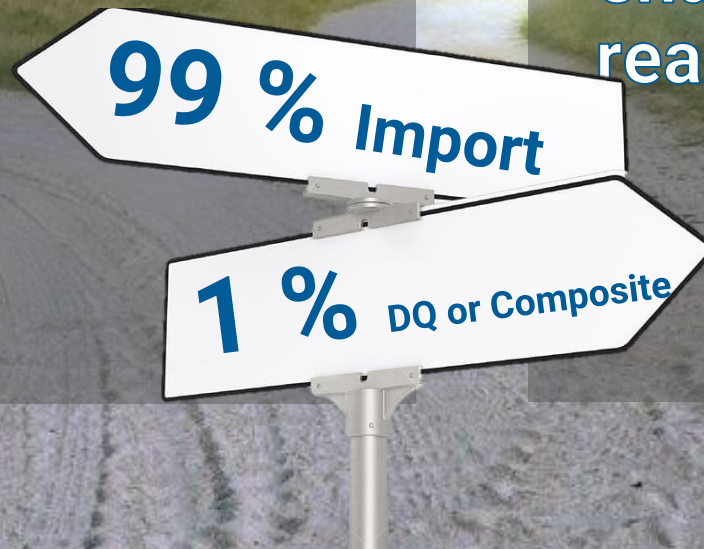
## Governed Data

- Publish to a secured & managed workspace
- Promote & Certify datasets
- Use dataflows for standardized common data models
- Enable users to connect to published datasets & create their own reports

# Storage Mode: Import vs DirectQuery

- Power BI is optimized to Import data into memory
- Uses columnar compression
- Highest performance

- DirectQuery doesn't copy data into model
- Usually slower & restrictive
- Hybrid/composite models enable both modes... drill to real-time data





































# Certified & Shared Datasets

- Use Dataset endorsement & certification in the service
- Certification can be managed by security group
- Access to datasets can be restricted to certified datasets
- Organization defines certification policy & provides documentation

Showing 8 items

NAME ↑	ENDORSEMENT	ACTIONS	REFRESHED	NEXT REFRESH	API A
ContosoDW Sales		    	5/1/2019, 8:04:36 AM	N/A	--
ContosoDW Sales (incomplete)		    	3/27/2019, 10:00:36 PM	N/A	--
ContosoDW Sales (PBDT 4-19)		    	3/20/2019, 2:30:26 PM	N/A	--
Lightning Talk - Web API Data Sources (0...		    	11/7/2018, 10:27:04 AM	N/A	--
World Peace		    	9/25/2018, 10:45:43 PM	N/A	--
World Peace-2018-09-27		    	9/27/2018, 2:23:21 PM	N/A	--

Admin portal

Usage metrics  
Users  
Audit logs  
Tenant settings  
Capacity settings  
Embed Codes  
Organizational visuals  
Dataflow settings  
Workspaces

Certification

*Unapplied changes*

Allow users in this org to certify datasets.

☒ Enabled

Specify URL for documentation page

Enter URL

Apply to:

☐ The entire organization

☒ Specific security groups

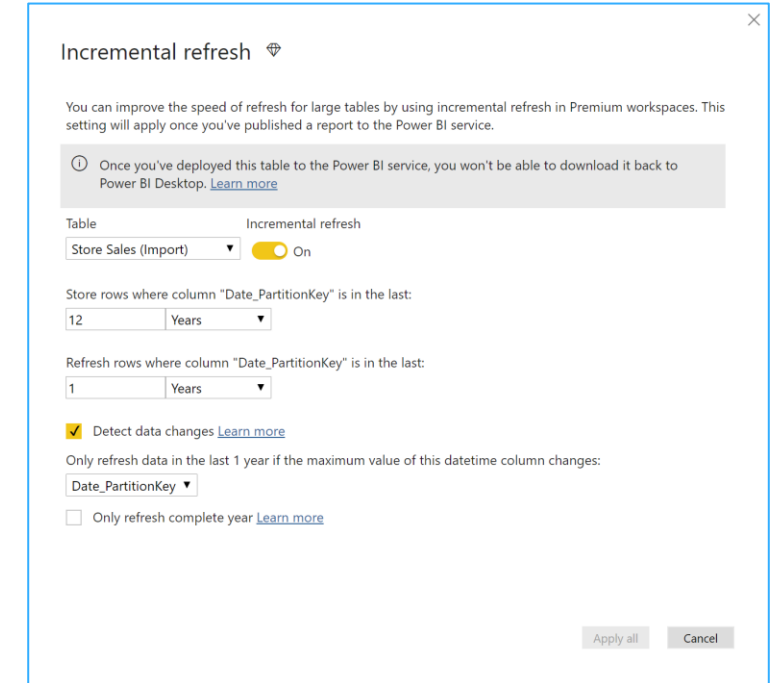
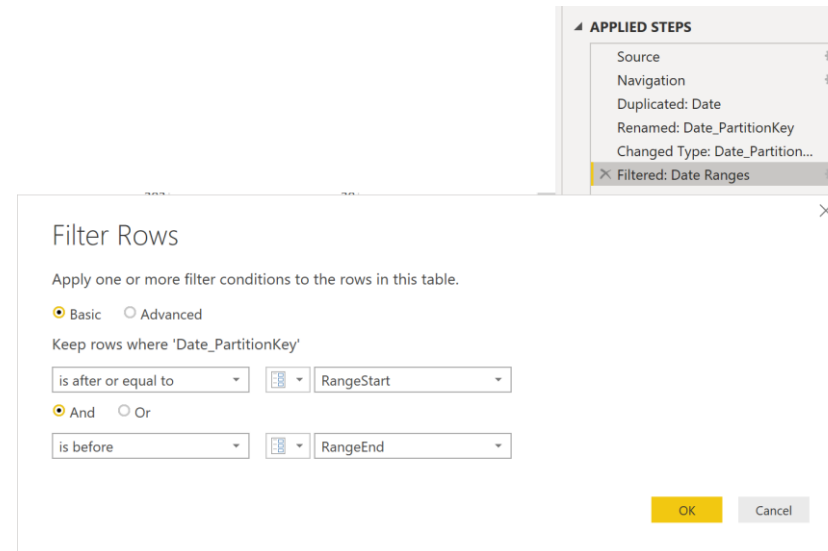
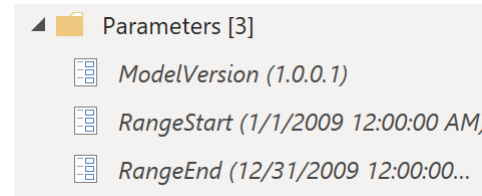
Enter security groups

☐ Except specific security groups

Apply Cancel

# Managing Dataset Size with Parameters

- Use parameters whether implementing incremental refresh or not
- **RangeStart & RangeEnd** parameters must be date/time type
- Apply range filter on date/time column in Power Query




\*Incremental Refresh is a Premium [capacity|user] feature but parameters may be used in any data model

# Futureproofing Solutions





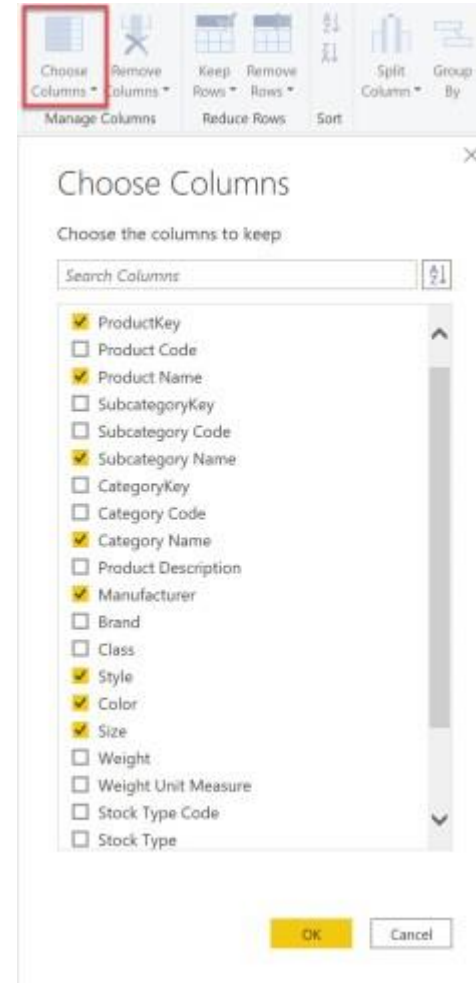
A close-up, slightly blurred image of Yoda's face from Star Wars, serving as the background for the slide. The image is dark and moody, with Yoda's green skin and large ears visible.

*Difficult to  
see;  
always in  
motion,  
the future  
is.*

- How is the source data procured and maintained?
- Who is responsible for maintaining source data?
- Who from the business defines the reporting requirements and signs-off on Power BI reports meeting those requirements?
- Who owns the development of the Power BI solution?
- Who is the developer's backup if they become unavailable?
- Are the requirements and project assets sufficiently documented to support such a transition?
- What are the security requirements?
- Who and how will users be given access to reports or dataset(s) for ad hoc analysis?
- Are users assigned to report and dataset permissions directly or through group membership?
- Should users have conditional or restricted access to data within the Power BI dataset?



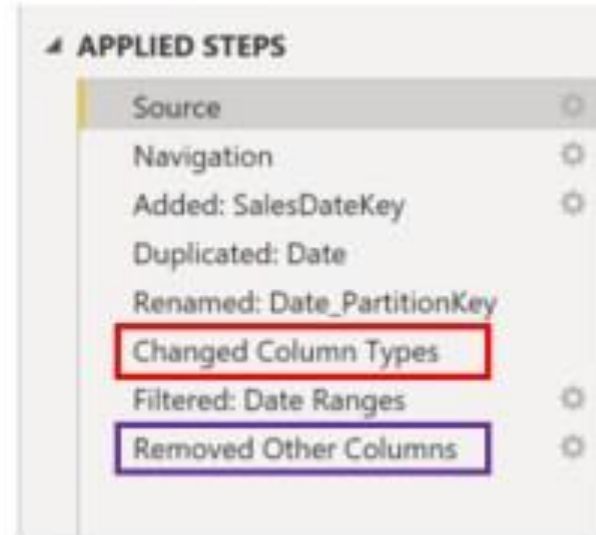
# Reduce Clutter – In Power Query



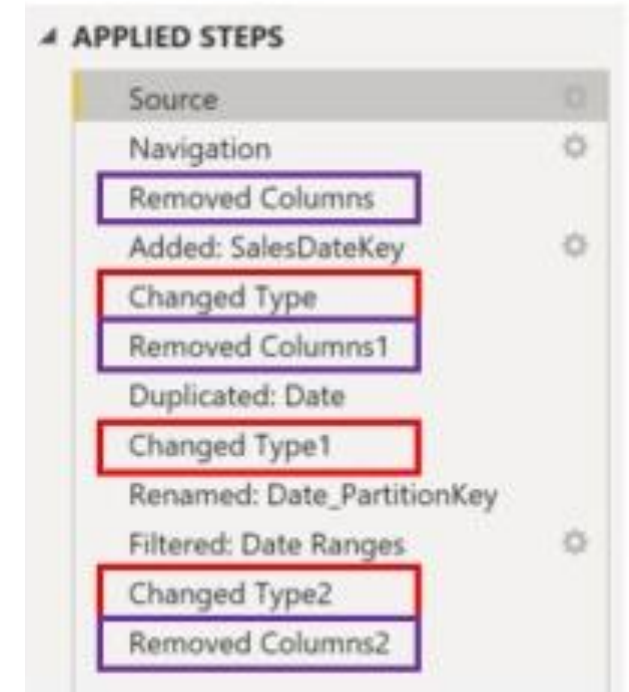
- Filter & parametrize queries
- Partition large tables
- Does It Fold?

- Test transformations with large data volumes
- Pivot, unpivot & Transpose actions are costly & may not work effectively with large data volume
- Complex and “creative” transformations might work in Desktop or with small data volumes but not in production
- Web service API calls & nested M functions may not work in the service.

Do this:



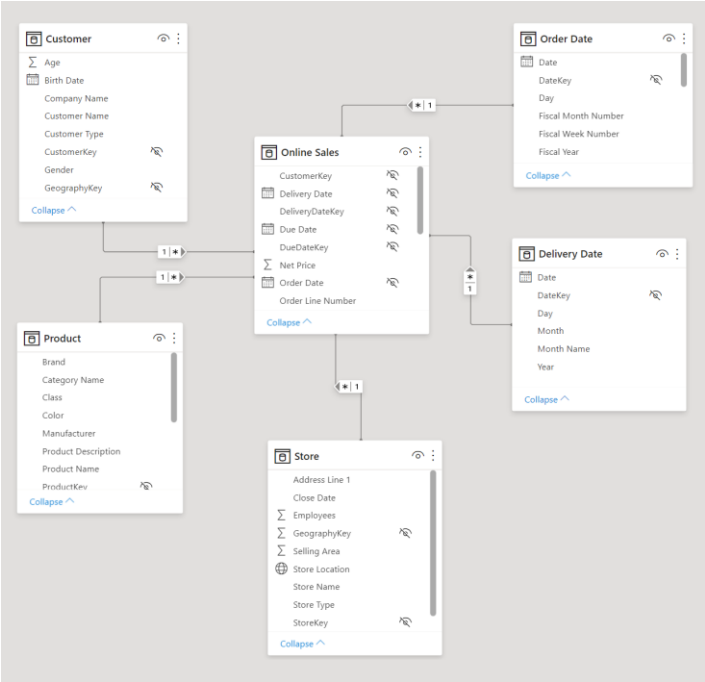
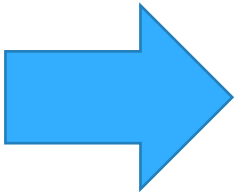
...not this:



# Dimensionalize It!



	EMPLOYEE [RP] CUSTOMER	CARRIER	PRODUCT PRODUCT TYPE [RU]	DELIVERY LOCATION SALES LOCATION	WAREHOUSE ADDRESS	PROMOTION PROBLEM REASON	ORDER ID [DD] SHIPMENT NUMBER [DD]	SHIP MODE					
	who			what		where		why & how					
SALES TARGETS													
salesperson has product type target		✓			✓	✓							
CUSTOMER ORDERS													
customer orders product	*	✓		✓	✓	✓	*			✓		*	
PRODUCT SHIPMENTS													
warehouse worker ships product	✓	✓	✓	✓	✓		✓	✓			✓	✓	*
CARRIER DELIVERIES													
carrier delivers product	✓		✓	✓	✓		✓				✓	✓	✓
CUSTOMER COMPLAINTS													
customer complains about product	✓	✓		✓	✓					✓	✓		
PRODUCT RETURNS													
customer returns product	✓			✓	✓		✓			✓	✓		



- Nearly any reporting data can be shaped into a star schema & optimized for analysis
- Ad hoc models never evolve into a dimensional model

## How Much Data

Power BI Tabular Engine is optimized for in-memory scans & calculations

Data volume:

- Millions of rows ?
- Billions of rows ?

Data model size:

- 1 GB
- 10 GB
- 100 GB
- 400 GB
- Terabytes & Petabytes

## Licensing Power BI

Power BI Pro	\$10/user
Premium per User	\$20/user
Premium Capacity (P1)	\$5k/Month
A1 – A6	\$735-\$3k
P2 – P5	\$10k-\$80k

# Model Size, Scale & Volume



## **Power BI Pro License**

**1 GB**

## **Premium Per User**

**100 GB**

## **Premium Capacity**

**400 GB**

## **Premium Capacity**

**Hybrid Data Models**

**No Stated Limits**

### Use:

- Import mode with parameters
- DirectQuery in composite models

[Doing Power BI the Right Way: 10. Designing and Managing Large Datasets | Paul Turley's SQL Server BI Blog](#)

# Planning for Separation

## The Thick and Thin of Reports

Separate reports and data models can be:

- Versioned
- Deployed & managed separately



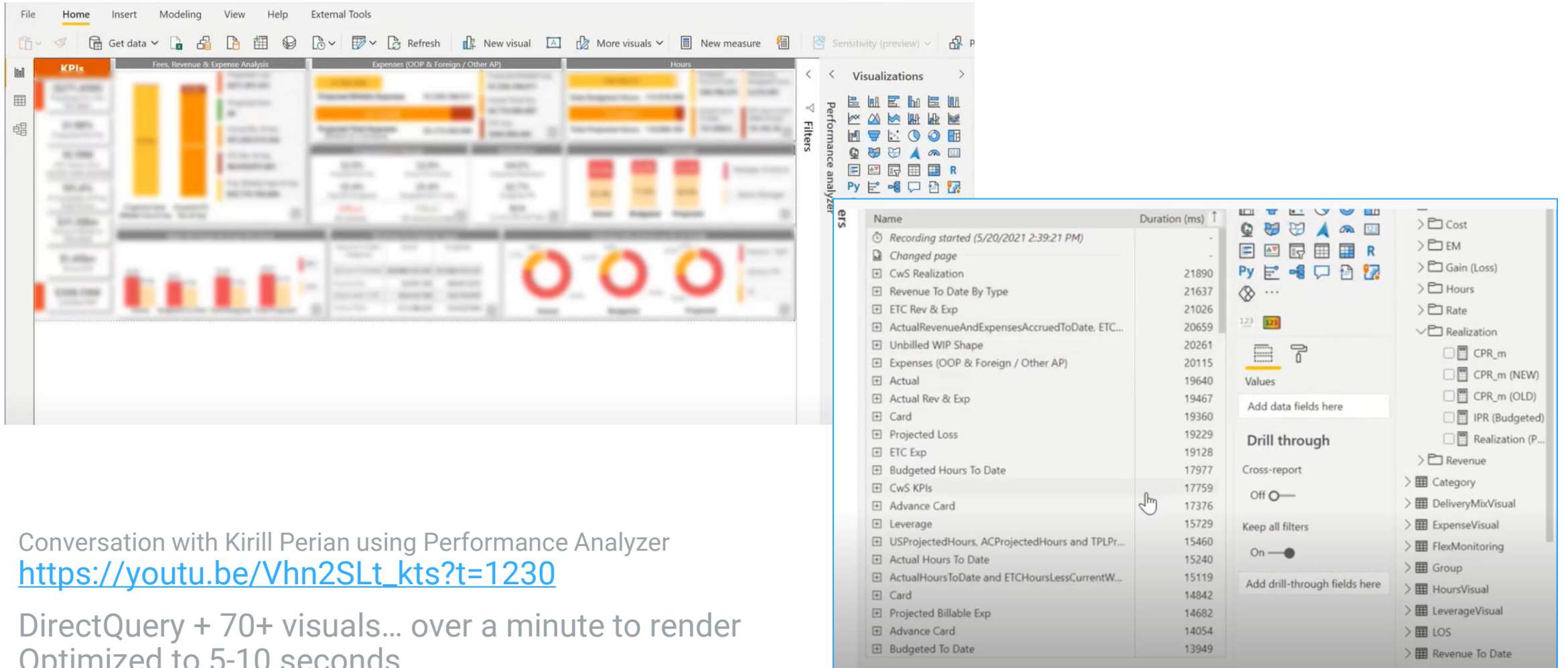
[Doing Power BI the Right Way: 7. Planning for separation – data models and reports | Paul Turley's SQL Server BI Blog](#)

Hot Swap tool demo: PowerBI.tips  
[PowerBI.tips - Hot Swap Connections Webinar – YouTube](#)  
<https://www.youtube.com/watch?v=syglUPMlgi0>



# Visualize With Care

## Reduce Clutter - In Reports





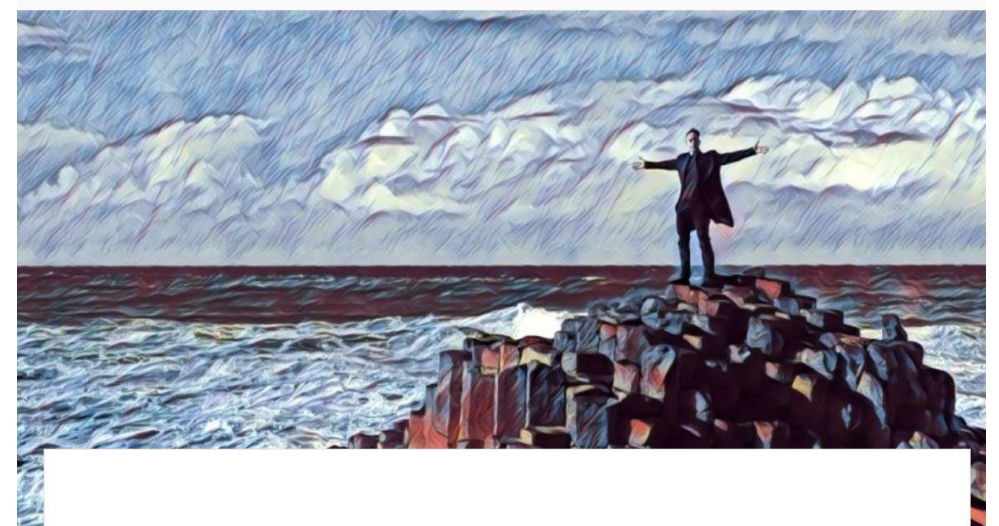
# Data Governance & Data Culture

Blog and video series from Matthew Roche

Power BI CAT Team

[Building a data culture – BI Polar \(ssbipolar.com\)](https://ssbipolar.com/building-a-data-culture/)  
<https://ssbipolar.com/building-a-data-culture/>

DataOnTheRoad.com – Interview with Matthew  
<https://youtu.be/Qkl-rpn0KSQ>



## Building a data culture

BI Polar has a series of videos and accompanying blog posts that focus on key aspects building a data culture. This series wrapped up in November 2020, and includes 3 hours 20 minutes of content delivered over 17 videos.

1. Series Intro: [Building a Data Culture](#)
2. [Data Culture: Executive sponsorship](#)
3. [Data Culture: A brief history of business intelligence](#)
4. [Data Culture: Roles and responsibilities](#)
5. [Data Culture: Picking your battles](#)
6. [Data Culture: The importance of community](#)
7. [Data Culture: Motivation and encouragement](#)
8. [Data Culture: Training for the community](#)
9. [Data Culture: Showcasing the art of the possible](#)
10. [Data Culture: The importance of a central portal](#)
11. [Data Culture: Making stakeholder buy-in explicit](#)
12. [Data Culture: Every app is a unique snowflake](#)
13. [Data Culture: Community champions with swords](#)
14. [Data Culture: The importance of experts](#)
15. [Data Culture: Measuring success](#)
16. [Data Culture: Wisdom from Sun Tzu](#)
17. [Data Culture: Wrapping up and closing words](#)

## Development & Release Process

- ✓ Separate models (datasets) from reports
- ✓ Deploy and manage separately
- ✓ Manage data model with Tabular Editor
- ✓ Use Deployment Pipelines for Apps



# Resources

# Enterprise Scale Options



In many ways, Power BI has now surpassed the capabilities of SQL Server Analysis Services. Microsoft are investing in the enterprise capabilities of the Power BI platform by enhancing Power BI Premium Capacity, adding Paginated Report and features to support massive scale specialized use cases. Consider the present and planned capabilities of the Power BI platform; before, choosing another data modeling tool such as SSAS.

## **Resources:**

<https://sqlserverbi.blog/2018/07/27/power-bi-for-grownups>

<https://sqlserverbi.blog/2018/12/13/data-model-options-for-power-bi-solutions>



# Master Project Preparation Checklist



## Solution Audience:

- ☐ Categorize the solution by identifying the author & user roles related to the project:
- ☐ Author role: Business Data Analyst
- ☐ Author role: Skilled Data Modeler, Analyst, Data Scientist
- ☐ Author role: IT BI Developer
- ☐ Users' role: Report/Dashboard Consumer
- ☐ Users' role: Self-service Report Author
- ☐ Users' role: Advanced Data Analyst

## Training and Usability Support:

- ☐ Develop & Document Support & training plan for users:
  - ☐ Usability training for read-only report/app users
  - ☐ Self-service reporting for Novice Report Authors & Data Analysts

## Solution Type & Architecture:

- ☐ Identify the Solution Type for the project. This will guide other project management designs:
- ☐ Design single PBIX file for small group, departmental project authored by one developer for a limited group of users
- ☐ Design & deploy a separate dataset PBIX file – from report file(s) – when the dataset should be branded as a Certified dataset
- ☐ Design separate dataset and report PBIX files for formal projects with more than one dataset & report developer, to coordinate work

- ☐ Use SSAS/AAS as a data modeling option when those databases exist or where IT operations insist on management development and maintenance through integrated source control (e.g. Visual Studio Team Services & Azure DevOps)
- ☐ Identify the Project Type & related Solution Architecture:
  - ☐ Project type: Formal project
  - ☐ Project type: Informal project
  - ☐ Project type: Hybrid project
  - ☐ Architectural approach: Single PBIX
  - ☐ Architectural approach: Separate dataset and report PBIX
  - ☐ Architectural approach: Report PBIX connected to SSAS or AAS

- ☐ Understand DirectQuery model trade-offs and special use cases. Avoid if possible.
- ☐ Define your Release Management, DevOps & Automation strategy (if any – Might be OK to deploy files manually, to automate or not to automate)

## File & Workspace Management:

- ☐ Create storage locations and folder structure for Development file management:
- ☐ Development file storage
- ☐ Team member collaboration environment & processes
- ☐ Folder synchronization
- ☐ Define File naming standards
- ☐ Decide on dataset and report names
- ☐ Define the Version Control & Lifecycle Management:

- ☐ Postfix files with 3-part version number
- ☐ Remove version number from published files in QA and PROD
- ☐ Create Version History table in Power Query
- ☐ Increment version numbers in data model
- ☐ Backup PBIX files for archive
- ☐ Create measures: Last Refresh Date/Time
- ☐ Create measure: Current Version
- ☐ Add data model info page to report

## Decide on Workspace and App Management, workspace & app name, etc.:

- ☐ Create PROD workspace (omit PRD from name), assign dedicated capacity if available.
- ☐ Create QA workspace (post-fix name with QA), assign dedicated capacity
- ☐ (optionally) Create DEV workspace (postfix name with DEV), dedicated capacity not required (or combine with QA workspace).

## Assign licenses and access:

- ☐ Assign Pro licenses to all developers, admins and report author users (QA?)
- ☐ Assign Free licenses to all users if Premium/app deployment will be used
- ☐ Assign membership and access to workspaces

## Query Design:

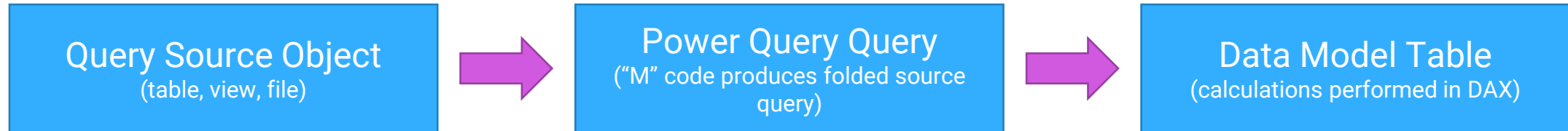
- ☐ Create fact date range filter parameters: RangeStart & RangeEnd to reduce volume in PBIX file under 400 MB.

- ☐ Filter large fact tables with range filters, consider incremental refresh policies if slow and/or over 800 MB compressed.
- ☐ Design source queries (T-SQL?) to reshape source data into conformed dimension & fact tables
- ☐ Create views in database for each dimension and fact
- ☐ Enforce key uniqueness to remove all duplicate keys from all dimension tables
- ☐ Query Date dim/lookup table at source if it exists
- ☐ If not available, generate Date dim/lookup table in Power Query

## Data modeling:

- ☐ Build star schemas
- ☐ Enforce dimension key uniqueness
- ☐ Avoid bi-directional filters & unnecessary bridging tables
- ☐ Consider using DAX measures rather than complex & inefficient relationships
- ☐ Create custom columns in Power Query
- ☐ Annotate code
- ☐ Hide all fields not used directly by users
- ☐ Use friendly field names
- ☐ Set to Do Not Summarize

# Query Optimization



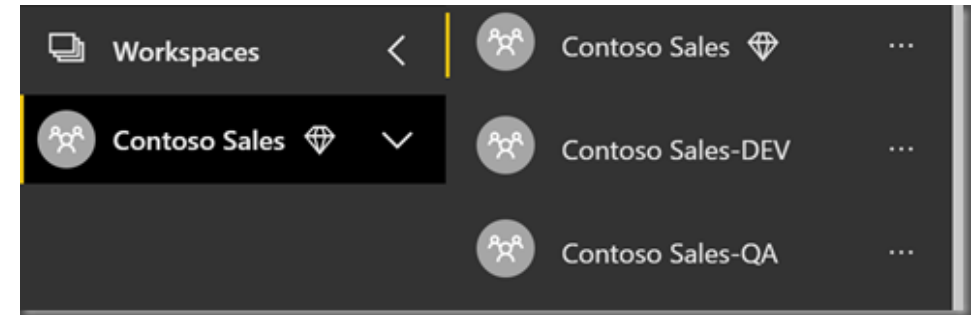
- ☐ **Decide:** Perform column transformations in ETL, database view, Power Query or DAX?
- ☐ **Decide:** How is process managed & governed? who maintains the query?
- ☐ Avoid using SQL statements in PQ queries. Use database views.  
*Views and tables support query folding. SQL statements generally do not.*
- ☐ Remove unnecessary columns & filter rows early in the query
- ☐ Consolidate field renaming, removing fields and data type changes
- ☐ Add custom columns in Power Query instead of calculated columns in DAX, where possible
- ☐ Use friendly field names for all fields that won't be hidden in the data model
- ☐ Rename steps and add annotations in M script

# Workspace and App Management



For a formal project, create the following workspaces:

- ☐ **DEV Workspace** - Only development team members need Contributor access to this workspace. This workspace does not need to have Premium capacity; unless, developers need to unit test incremental refresh or other Premium features.
- ☐ **QA Workspace** - All testers must have View access for testing and Contributor access for report authoring. Should be in Premium capacity to test incremental refresh.
- ☐ **PROD Workspace** - Omit the “PROD” designation in the name. This workspace will be the name of the published app that users will see in their Apps, Home and Favorite pages so use a name that is simple and sensible. Must have Premium capacity to share the app with non-Pro licensed users.





# Power BI Licensing Plan Checklist



## Capacity and platform:

### Shared capacity service:

☐ Assign user licenses

### Dedicated capacity:

☐ Are Premium features required?

☐ Is dedicated capacity needed?

☐ Is Premium more cost-effective than licensing all users?

### On-premises server:

☐ SQL Server Enterprise + SA, or:

☐ Premium license

## Assign user licenses and access:

☐ Assign Pro licenses to all developers, admins and report author users

☐ If Premium, use app deployment & assign Free licenses to all users

☐ Assign membership and access to workspaces

# Managing Power BI Desktop Files

- **Store in a centrally managed network-assessable folder**  
The storage folder should support automatic backup and recovery in the case of storage loss.
- **Report and dataset developers must open files from the Windows file system**  
Files must either reside in or be synchronized with the Windows file system.
- Files containing imported data typically range in size from 100 to 600 MB. Any shared folder synchronization or disaster recovery system should be designed to effectively handle multiple files of this size.

## Options:

- OneDrive For Business (shared by team, with folder synchronization).
- SharePoint or SharePoint Online (with folder synchronization).
- GitHub and/or VSTS with local repository & folder synchronization. If used, Git must be configured for large file storage (LFS) if PBIX files are to be stored in the repository.

# Data model & Report Architecture

## Choose dataset architecture:

- ☐ **Single PBIX file**  
For small group, departmental project authored by one developer for a limited group of users
- ☐ **Separate dataset and report PBIX**  
Design & deploy a separate dataset PBIX file – from report file(s) – when the dataset should be branded as a Certified dataset.  
For formal projects with more than one dataset & report developer, to coordinate work
- ☐ **SSAS/AAS as a data modeling option**  
when those databases exist or where IT operations insist on managing development and maintenance through integrated source control (e.g. Visual Studio Team Services & Azure DevOps)
- ☐ **Migrate PBIX to Model.BIM**

# Model Design Checklist



- ☐ **Model for the user experience, not for developers**

- ☐ **Build star schemas**

Wherever possible, reshape data into fact a dimension tables with single key, one-to-many relationships from dimensions to fact.

- ☐ **Enforce dimension key uniqueness**

Just because a key value “should” be unique, there is no guarantee that it will be unless enforced at the data source. Perform grouping and duplicate reduction in the data source views or Power Query queries to guarantee uniqueness. Duplicate record count checks and other mechanisms can be applied to audit source data for integrity but do not allow the data model to violate these rules.

- ☐ **Avoid bi-directional filters & unnecessary bridging tables**

These data modelling patterns adversely affect performance.

- ☐ **Consider using DAX measures** rather than complex & inefficient relationships

- ☐ **Create custom columns in Power Query**

Rather than DAX calculated columns wherever possible for

row-level derived columns. This maintains a consistent design pattern for maintainability.

- ☐ **Annotate code**

Use in-line comments and annotations in all code including SQL, M and DAX; to explain calculation logic and provide author and revision information.

- ☐ **Remove all unused fields** – if in doubt, take it out

- ☐ **Hide all fields not used directly by users**

primary and foreign key columns, numeric columns used to create measures, and columns used to specify the sort order of other fields.

- ☐ **Use friendly field names**

Rename all visible columns (in Power Query) to short but user-friendly names with mixed case and spaces.

- ☐ **Set to Do Not Summarize**

Any non-hidden numeric columns that are not intended to roll-up or summarize values. Columns set to summarize are indicated with a Sigma icon.

# Model Design Guidelines

- Dimensional design concepts haven't changed in 20 years & are as true as ever
- Dimensional modeling “rules” should be followed but can be relaxed for Power BI in certain cases, such as:
  - Leaving some dimensional attributes in fact tables
  - Use natural keys rather than generating surrogate keys
- The art of dimensional modeling ranges from simple to complex. Start with the basics.
- Flattened “spreadsheet” models are OK for small, informal projects but have significant limitations
- As models grow in size & complexity, data quality challenges will surface that can be solved by implementing proper governance controls

The Kimball Method: <https://www.kimballgroup.com/data-warehouse-business-intelligence-resources/kimball-techniques/dimensional-modeling-techniques>

Lawrence Corr, Model Storming Agile method: <https://modelstorming.com/hierarchy-map>



# Report Types

## Dashboard & Scorecard style reporting

- ☐ Infographics
- ☐ KPIs & scorecards
- ☐ Segmented comparisons
- ☐ Time-series trends

## Statistical & Scientific analysis

- ☐ Deviations & percentiles
- ☐ Forecast trends & predictions
- ☐ Scatter plots
- ☐ Population analysis

## Financial balances & worksheets

- ☐ Cost accounting & balance sheets
- ☐ General ledger
- ☐ Accounts receivable & payable
- ☐ Invoices
- ☐ Forms & lists



Questions?