



Data Modeling 101

#PowerBler





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After this session you will be able to:



Explain basic dimensional modeling concepts



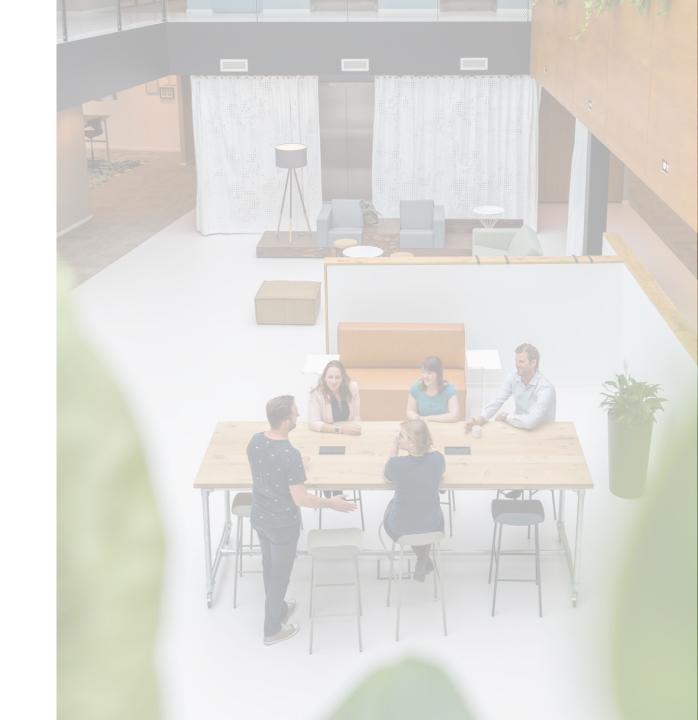
Create a basic dimensional model that works and performs well with Power BI



Decide when to use Power Query vs the data model and Calculated Columns vs Measures



Handle complex situations with inactive relationships and role-playing dimensions

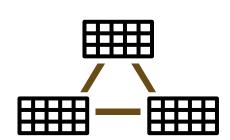


Set the stage

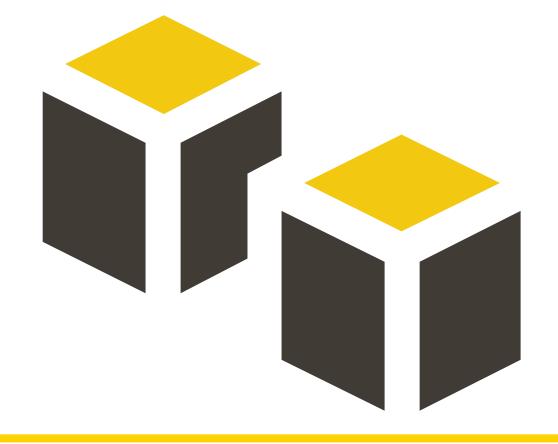
Gather Clean Model Visualize











Data modeling basics



What is a data model?

A Power BI Data Model is a collection of tables with relationships which enable business users to easily understand and explore their data to get business insights.

A good data model is important, because:

- Improves understandability of the data
- Increases performance of dependent processes and systems
- Increases resilience to change

Why do you need a data model in Power BI?

- Easily drag-and-drop visuals
- Re-use of components (when expanding the model)
- Optimize end-user rendering performance

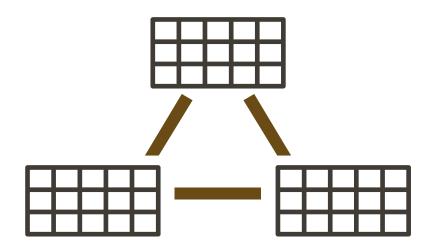


What is a good data model?

A good data model for Power BI is a dimensional data model.

A dimensional data model consists of:

- One or more fact tables
- One or more dimension tables
- One or more relationships





Starting point





INVOICE

Adventure Works

INVOICE SO74869 ORDER DATE: 6/11/2020 SHIP DATE:

TO: AW00019377 Dominic Chandra Ingolstadt 85049 Germany

| QUANTITY | DESCRIPTION | UNIT PRICE | TOTAL |
|----------|------------------------------------|------------|----------|
| 1 | AWC Logo Cap (CA-1098) | \$8.99 | \$8.99 |
| 1 | Fender Set – Mountain (FE-6654) | \$21.98 | \$21.98 |
| 1 | ML Mountain Tire (TI-M602) | \$29.99 | \$29.99 |
| 1 | Mountain Bottle Cage (BC-M005) | \$9.99 | \$9.99 |
| 1 | Mountain Tire Tube (TT-M928) | \$4.99 | \$4.99 |
| 1 | Sport-100 Helmet, Blue (HL-U509-B) | \$34.99 | \$34.99 |
| 1 | Water Bottle - 30 oz. (WB-H098) | \$4.99 | \$4.99 |
| | | TOTAL DUE | \$115.92 |

Make all checks payable to Adventure Works.

If you have any questions concerning this invoice, contact: info@adventureworks.com

THANK YOU FOR YOUR BUSINESS!

Creating Sales Amount fact



Adventure Works

TO: AW00019377 Dominic Chandra Ingolstadt 85049 Germany

INVOICE

INVOICE SO74869 ORDER DATE: 6/11/2020 SHIP DATE:

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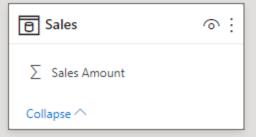
If you have any questions concerning this invoice, contact: info@adventureworks.com

THANK YOU FOR YOUR BUSINESS!

Tables

Sales

| Sales Amount | Ŧ |
|--------------|-----|
| \$8 | .99 |
| \$21 | .98 |
| \$29 | .99 |
| \$9 | .99 |
| \$4 | .99 |
| \$34 | .99 |
| \$4 | .99 |
| | |





Adding Order Quantity fact



Adventure Works

TO: AW00019377 Dominic Chandra Ingolstadt 85049 Germany

INVOICE

INVOICE SO74869 ORDER DATE: 6/11/2020 SHIP DATE:

| QUANTITY | DESCRIPTION | UNIT PRICE | TOTAL |
|----------|--|------------|----------|
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| 1 | Sport-100 <u>Helmet</u> , Blue (HL-U509-B) | \$34.99 | \$34.99 |
| 1 | Water Bottle - 30 oz. (WB-H098) | \$4.99 | \$4.99 |
| | | TOTAL DUF | \$115.92 |

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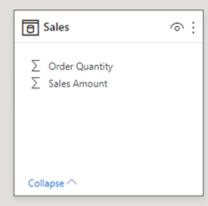
If you have any questions concerning this invoice, contact: info@adventureworks.com

THANK YOU FOR YOUR BUSINESS!

Tables

Sales

| Sales Amount | Order Quantity | _ |
|--------------|----------------|---|
| \$8.99 | | 1 |
| \$21.98 | | 1 |
| \$29.99 | | 1 |
| \$9.99 | | 1 |
| \$4.99 | | 1 |
| \$34.99 | | 1 |
| \$4.99 | | 1 |





Fact table

Contains numerical information about a business process or items to be aggregated

Examples: Sales Amount, Cost, Units Sold, Transactions

Aggregations provide totals, averages, etc.

Power BI implements these using Measures

Usefulness limited without context

Context is provided by dimensions that slice the data

Without facts there is no aggregation



Adding Product Dimension table



Adventure Works

TO: AW00019377 Dominic Chandra Ingolstadt

85049 Germany

INVOICE

INVOICE SO74869 ORDER DATE: 6/11/2020 SHIP DATE:

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|----------|--|------------|----------|
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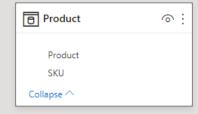
Tables

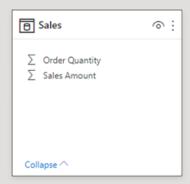
Product

| Product |
|-------------------------|
| AWC Logo Cap |
| Fender Set - Mountain |
| ML Mountain Tire |
| Mountain Bottle Cage |
| Mountain Tire Tube |
| Sport-100, Helmet, Blue |
| Water Bottle - 30 oz. |
| |

Sales

| Sales Amount | Order Quantity |
|--------------|----------------|
| \$8.99 | 1 |
| \$21.98 | 1 |
| \$29.99 | 1 |
| \$9.99 | 1 |
| \$4.99 | 1 |
| \$34.99 | 1 |
| \$4.99 | 1 |







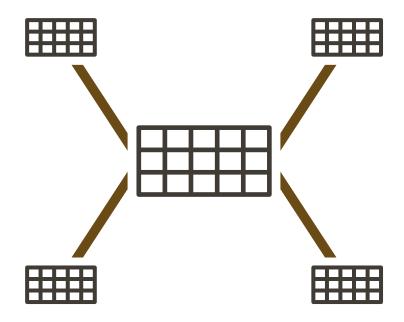
Dimension table

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.





Adding Product attribute to fact table



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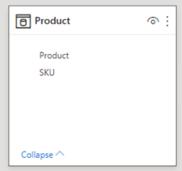
Tables

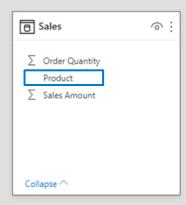
Product

| SKU 🔻 | Product | | |
|-----------|-------------------------|--|--|
| CA-1098 | AWC Logo Cap | | |
| FE-6654 | Fender Set - Mountain | | |
| TI-M602 | ML Mountain Tire | | |
| BC-M005 | Mountain Bottle Cage | | |
| TT-M928 | Mountain Tire Tube | | |
| HL-U509-B | Sport-100, Helmet, Blue | | |
| WB-H098 | Water Bottle - 30 oz. | | |

Sales

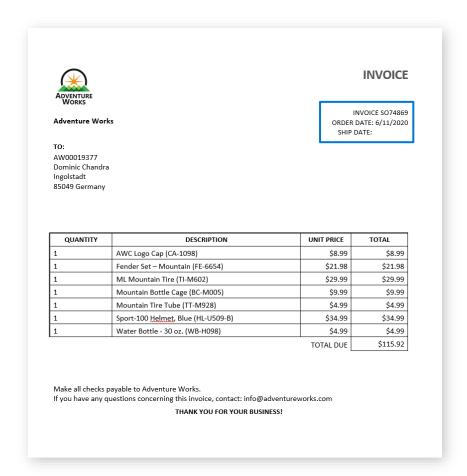
| Sales Amount | Order Quantity 🔻 | Product 💌 |
|--------------|------------------|-----------|
| \$8.99 | 1 | CA-1098 |
| \$21.98 | 1 | FE-6654 |
| \$29.99 | 1 | TI-M602 |
| \$9.99 | 1 | BC-M005 |
| \$4.99 | 1 | TT-M928 |
| \$34.99 | 1 | HL-U509-B |
| \$4.99 | 1 | WB-H098 |







Adding Sales Order and Order Date attribute to fact

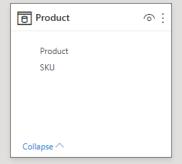


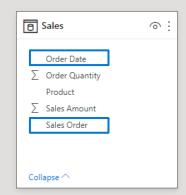
Tables

Sales

| Sales Amount 🔻 | Order Quantity 🔻 | Product 💌 | Sales Order | Order Date 🔻 |
|----------------|------------------|-----------|-------------|--------------|
| \$8.99 | 1 | CA-1098 | SO74869 | 6/11/2020 |
| \$21.98 | 1 | FE-6654 | SO74869 | 6/11/2020 |
| \$29.99 | 1 | TI-M602 | SO74869 | 6/11/2020 |
| \$9.99 | 1 | BC-M005 | SO74869 | 6/11/2020 |
| \$4.99 | 1 | TT-M928 | SO74869 | 6/11/2020 |
| \$34.99 | 1 | HL-U509-B | SO74869 | 6/11/2020 |
| \$4.99 | 1 | WB-H098 | SO74869 | 6/11/2020 |
| \$8.99 | 2 | CA-1098 | SO74870 | 7/11/2020 |

Product







Adding relationship between Product and Sales



INVOICE

INVOICE SO74869

ORDER DATE: 6/11/2020 SHIP DATE:

Adventure Works

85049 Germany

TO: AW00019377 Dominic Chandra Ingolstadt

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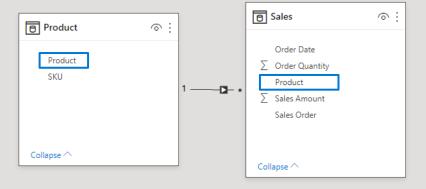
THANK YOU FOR YOUR BUSINESS!

Tables

Sales

| Sales Amount | Order Quantity 🔻 | Product 💌 | Sales Order | Order Date 🔻 |
|--------------|------------------|-----------|-------------|--------------|
| \$8.99 | 1 | CA-1098 | SO74869 | 6/11/2020 |
| \$21.98 | 1 | FE-6654 | SO74869 | 6/11/2020 |
| \$29.99 | 1 | TI-M602 | SO74869 | 6/11/2020 |
| \$9.99 | 1 | BC-M005 | SO74869 | 6/11/2020 |
| \$4.99 | 1 | TT-M928 | SO74869 | 6/11/2020 |
| \$34.99 | 1 | HL-U509-B | SO74869 | 6/11/2020 |
| \$4.99 | 1 | WB-H098 | SO74869 | 6/11/2020 |
| \$8.99 | 2 | CA-1098 | SO74870 | 7/11/2020 |

Product





Relationship

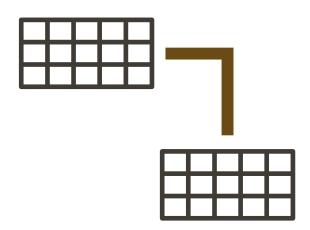
Connection between two tables using columns from each.

Usually between fact and dimension or dimension and dimension.

Without relationships there is no slicing.

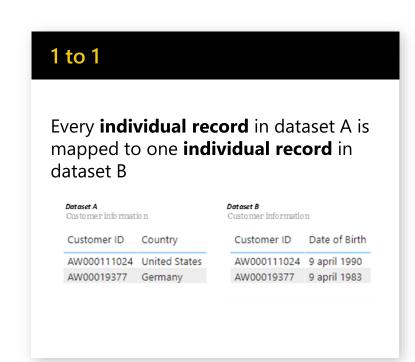
Three kinds:

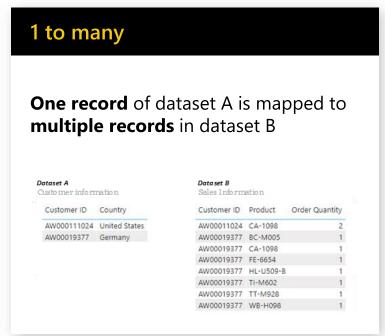
- One-to-many (1:M)
- One-to-one (1:1)
- Many-to-many (M:N)





Relationship types









Adding customer dimension



Adventure Works

TO: AW00019377 Dominic Chandra Ingolstadt 85049 Germany

INVOICE

INVOICE SO74869 ORDER DATE: 6/11/2020 SHIP DATE:

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Tables

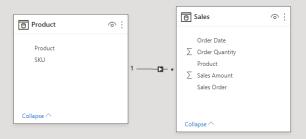
Customer

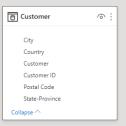
Product

| Customer ID 💌 | Customer | City - | Postal Code 💌 | Country 💌 | State-Province |
|---------------|-----------------|------------|---------------|-----------|----------------|
| AW00019377 | Dominic Chandra | Ingolstadt | 85049 | Germany | Bayern |

Sales

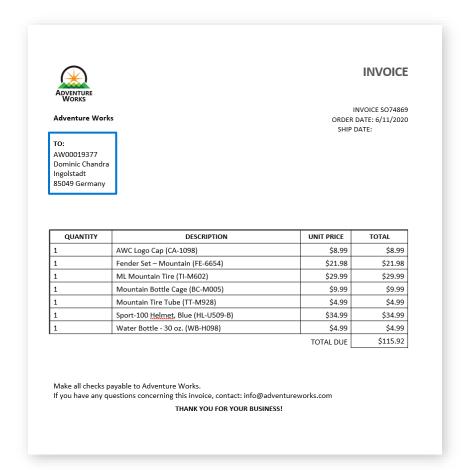
| Sales Amount 🔻 | Order Quantity | Product 💌 | Sales Order | Order Date |
|----------------|----------------|-----------|-------------|------------|
| \$8.99 | 1 | CA-1098 | SO74869 | 6/11/2020 |
| \$21.98 | 1 | FE-6654 | SO74869 | 6/11/2020 |
| \$29.99 | 1 | TI-M602 | SO74869 | 6/11/2020 |
| \$9.99 | 1 | BC-M005 | SO74869 | 6/11/2020 |
| \$4.99 | 1 | TT-M928 | SO74869 | 6/11/2020 |
| \$34.99 | 1 | HL-U509-B | SO74869 | 6/11/2020 |
| \$4.99 | 1 | WB-H098 | SO74869 | 6/11/2020 |
| \$8.99 | 2 | CA-1098 | SO74870 | 7/11/2020 |







Adding customer attribute on fact and relationship



Tables

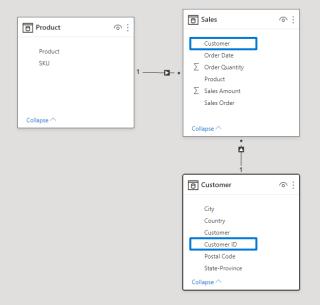
| Customer ID 💌 | Customer 💌 | City 🔻 | Postal Code 🔻 | Country 🔻 | State-Province 🔻 |
|---------------|-----------------|------------|---------------|-----------|------------------|
| AW00019377 | Dominic Chandra | Ingolstadt | 85049 | Germany | Bayern |

Sales

| Sales Amount | Order Quantity 🔻 | Product 💌 | Sales Order | Order Date 🔻 |
|--------------|------------------|-----------|-------------|--------------|
| \$8.99 | 1 | CA-1098 | SO74869 | 6/11/2020 |
| \$21.98 | 1 | FE-6654 | SO74869 | 6/11/2020 |
| \$29.99 | 1 | TI-M602 | SO74869 | 6/11/2020 |
| \$9.99 | 1 | BC-M005 | SO74869 | 6/11/2020 |
| \$4.99 | 1 | TT-M928 | SO74869 | 6/11/2020 |
| \$34.99 | 1 | HL-U509-B | SO74869 | 6/11/2020 |
| \$4.99 | 1 | WB-H098 | SO74869 | 6/11/2020 |
| \$8.99 | 2 | CA-1098 | SO74870 | 7/11/2020 |

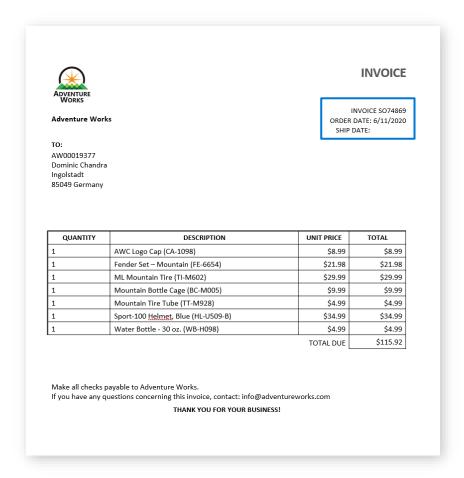
Customer

Product





Adding Date dimension and relationship



Tables

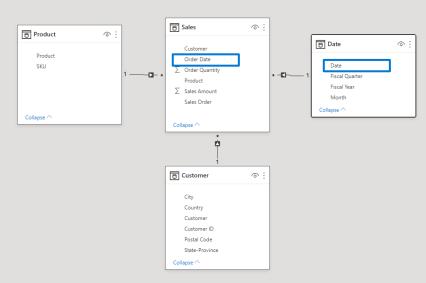


| Date ~ | Fiscal Quarter | Fiscal Year 💌 | Month 💌 |
|-----------|----------------|---------------|-----------|
| 6/11/2020 | FY2020 Q4 | FY2020 | 2020 Jun |
| 7/11/2020 | FY2021 Q1 | FY2021 | 2021 July |

Product

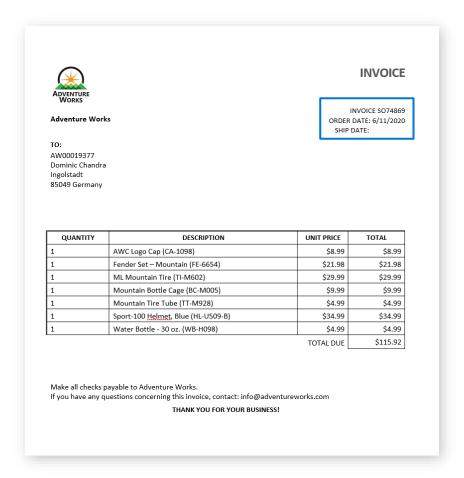
Customer

Sales





Adding Ship Date attribute and relationship



Tables

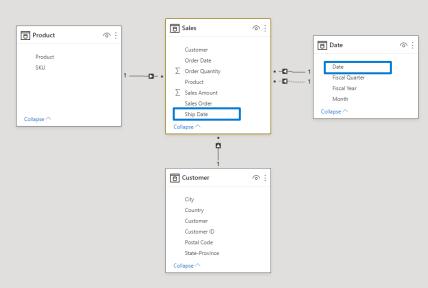


| Date 🔻 | Fiscal Quarter | Fiscal Year 💌 | Month 🔻 |
|-----------|----------------|---------------|-----------|
| 6/11/2020 | FY2020 Q4 | FY2020 | 2020 Jun |
| 7/11/2020 | FY2021 Q1 | FY2021 | 2021 July |

Product

Customer

Sales





Role playing dimension

Role playing dimension: same dimension being used multiple times

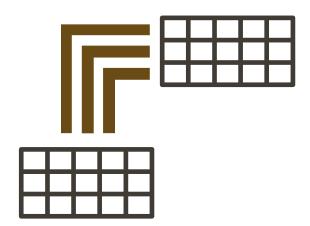
Example: Date dimension (OrderDate, ShipDate)

In Power BI: one active relationship between two tables

- Any other will be inactive
- USERELATIONSHIP()

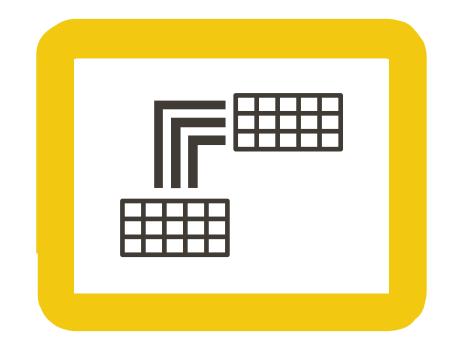
Auto date/time

- Auto date/time creates a date table for each date that is not used in a relationship
- Might be worth it to introduce your own date dimension



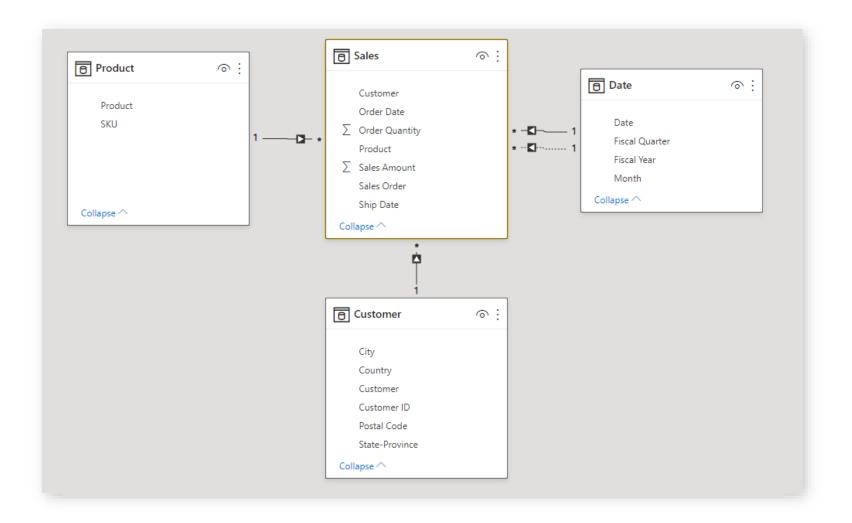


Role-playing dimensions





Final model



Note

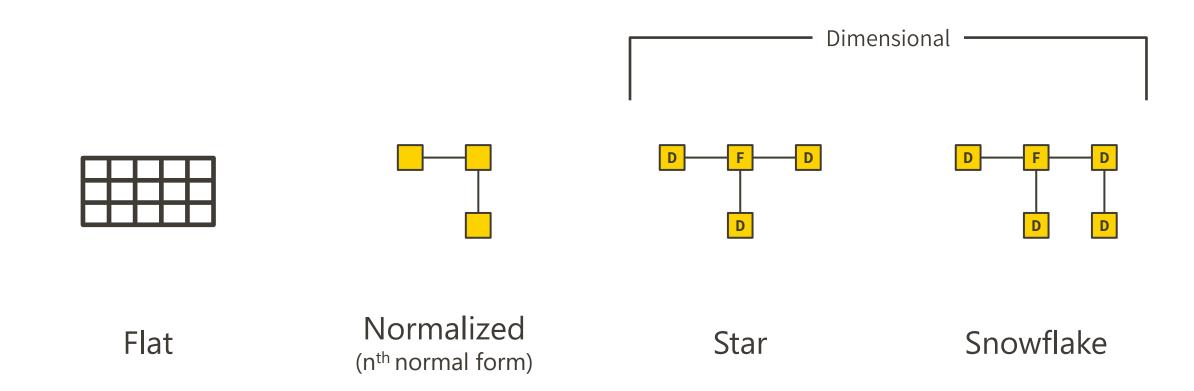
This is a simplified, imperfect data model:

- Keys should be numerical instead of strings (surrogate keys)
- Sales Order should be separate dimension since the fact is on Sales Order Line, not Sales Order.





Major types of data models





Different data model types

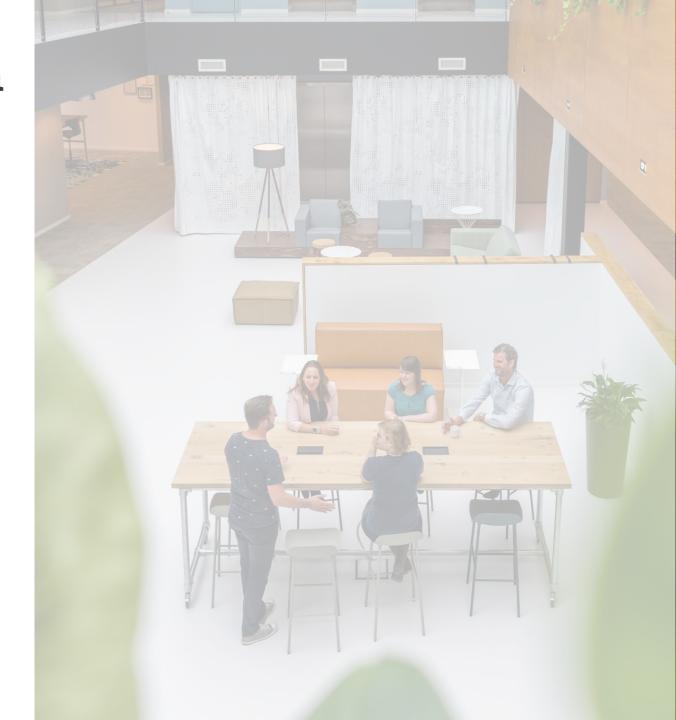
| | | Flat table | Normalized | Star schema | Snowflake |
|----------|-----------------------------|------------------------------|-------------------------------|---|---|
| ↓ | Performance for analytics | Low | Medium | High | High |
| | Development effort | Low | High | High | High |
| * | Query volume and complexity | Low volume Low complexity | High volume Low complexity | Low volume High complexity | Low volume High complexity |
| 2 | Intended for | No database | CRM / ERP / Applications | Analytical systems / data warehouses | Analytical systems / data warehouses |
| <u></u> | Compression | Row | Row | Column | Column |

Considerations for data modeling in Power BI

Do data cleansing activity in one place.

- Data platform
- Database views
- Power Query

Enrich your data with measures and calculated columns.

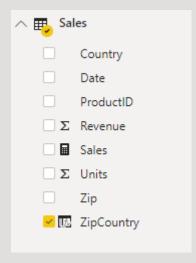


Calculated Column

To create a calculated column using a DAX formula, select the New column button from the Modeling tab.

A calculated column:

- Is useful for slicing or filtering a value, or for doing a calculation on every row in the table
- Saves its result in the data model
- Evaluates while reloading the data model, not while executing the query
- Consumes memory! (increases model size)
- Evaluates per row



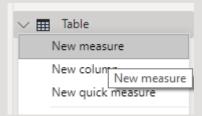


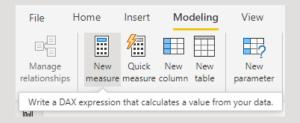
Measure

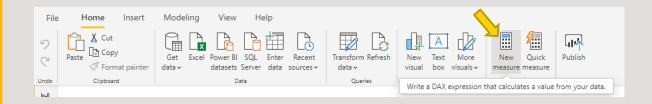
To create a measure using a DAX formula, select the New measure button from the Modeling tab.

A measure:

- Aggregates a column
- Evaluates a total, not row-per-row
- Evaluates while executing the query
- Costs CPU-power instead of memory
- Always has one answer









Calculated column vs Measure

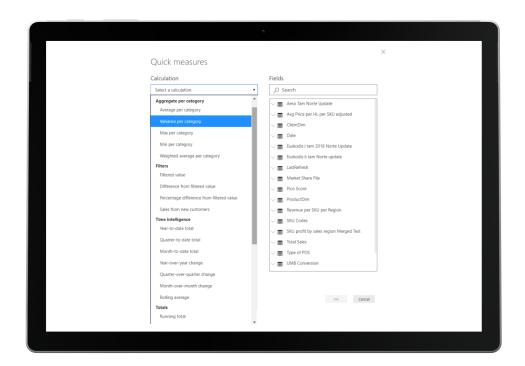
| | Calculated Column | Measure |
|------------------------|--|---|
| Persistence | Definition and result saved in data model | Definition saved in data model, result is calculated when a visual is created |
| Usage | Can be used on slicers, filters, rows, columns, etc. | Can only be used as a value in a visual and visual level filters |
| Language | DAX / M (Power Query) | DAX |
| Scope | Single row | Set of rows / table |
| Calculation happens | On data refresh | On demand when a visual is created |
| Effect | Blows up data model | Increases report performance (compared to calculated column) |

| ProductID 🔻 | Date 🔻 | CustomerID - | CampaignID 🔻 | Units 🔻 | Sales Amount 🔻 |
|-------------|---------|--------------|--------------|---------|----------------|
| 449 | 7/29/14 | 128304 | 1 | 1 | \$102.37 |
| 449 | 7/29/14 | 89917 | 1 | 1 | \$102.37 |
| 449 | 7/29/14 | 128811 | 1 | 1 | \$102.37 |
| 449 | 7/29/14 | 59550 | 1 | 1 | \$102.37 |
| 449 | 7/29/14 | 207690 | 1 | 1 | \$102.37 |
| 449 | 7/29/14 | 121043 | 1 | 1 | \$102.37 |
| 449 | 7/29/14 | 148675 | 1 | 1 | \$102.37 |
| 449 | 7/29/14 | 65048 | 1 | 1 | \$102.37 |



Quick measures

You can make many difficult DAX calculations without code, just drag and drop.





Measures and Calculated Columns





Rules to live by



DAX complexity down, Performance up



Simple DAX is a sign of a good data model



Key take-aways

- Do data transformation as close to the source as possible. In Power BI: use the "Transform Data" options.
- Use a star schema or snowflake data model to get the best out of Power BI.
- Consider auto date/time vs creating a Date dimension
- Use a role-playing dimension instead of adding the same dimension multiple times.
 - Most common example: Date





Resources

Learning path: Model data in Power BI:

https://docs.microsoft.com/en-us/learn/paths/model-power-bi/

Learning path: Use DAX in Power BI Desktop:

https://aka.ms/DAXLearningPath

Guidance: Auto date/time in Power BI desktop:

https://docs.microsoft.com/en-us/power-bi/transform-model/desktop-auto-date-time

Quick measure gallery:

https://community.powerbi.com/t5/Quick-Measures-Gallery/bd-p/QuickMeasuresGallery

DAX Expression: USERELATIONSHIP:

https://docs.microsoft.com/en-us/dax/userelationship-function-dax

AdventureWorks 2020 demo dataset:

https://github.com/microsoft/powerbi-desktop-samples/tree/master/DAX





Want to review all this content?

Webinar Series: Mastering Data Modeling with Power BI

Episode 1 - Data Modeling 101: Increasing the Impact of Power BI

by Jeroen ter Heerdt and Marc Lelijveld

Watch now ☑



by Jeroen ter Heerdt and Marc Lelijveld

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Webinar Series: Mastering Data Modeling with Power BI

Episode 3 - Data Modeling for Experts with Power BI

by Jeroen ter Heerdt and Marc Lelijveld

Register to watch on September 8th, 2021 10AM – 11AM Pacific Time ☑

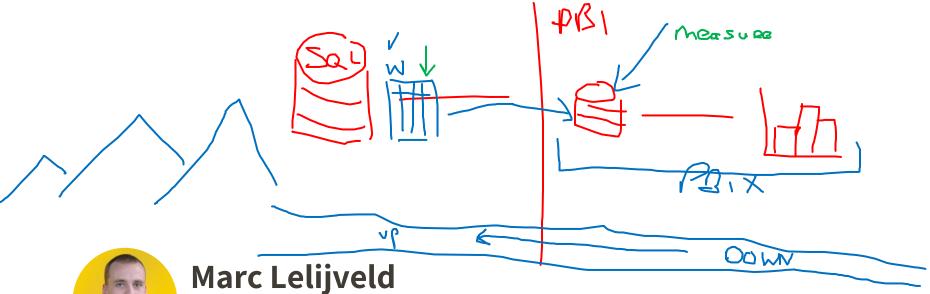
Find them all here: https://docs.microsoft.com/en-us/power-bi/fundamentals/webinars

or: aka.ms/DataModelingWebinarEpisode{1/2/3}





Thanks for attending!





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