

# CREATING A DATA MODEL

## CREATING A DATA MODEL



In this section we'll cover **foundational data modeling topics** like normalization, fact and dimension tables, primary and foreign keys, relationship cardinality and filter flow

### TOPICS WE'LL COVER:

Data Modeling 101

Normalization

Facts & Dimensions

Primary & Foreign Keys

Cardinality

Filter Flow

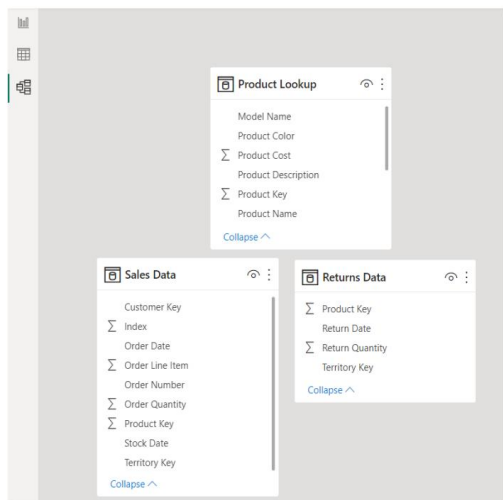
Common Schemas

Hierarchies

### GOALS FOR THIS SECTION:

- Understand the basic principles of data modeling, including normalization, fact & dimension tables and common schemas
- Create table relationships using primary and foreign keys, and discuss different types of relationship cardinality
- Configure report filters and trace filter context as it flows between related tables in the model
- Explore data modeling options like hierarchies, data categories and hidden fields

## WHAT IS A DATA MODEL?

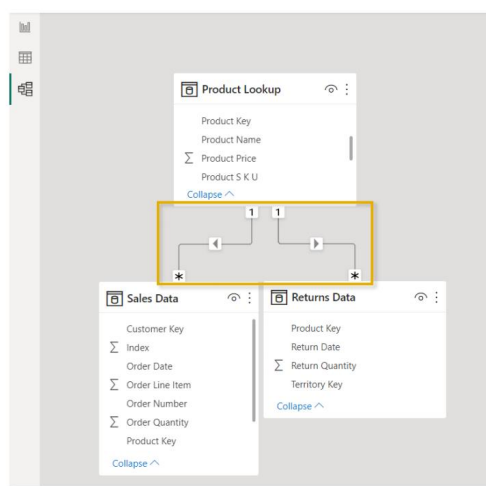


This **IS NOT** a data model 😞

- This is a collection of independent tables, which share no connections or relationships
- If you tried to visualize **Orders** and **Return** by **Product**, this is what you'd get

| ProductName            | OrderQuantity | ReturnQuantity |
|------------------------|---------------|----------------|
| All-Purpose Bike Stand | 84,174        | 1,828          |
| AWC Logo Cap           | 84,174        | 1,828          |
| Bike Wash - Dissolver  | 84,174        | 1,828          |
| Cable Lock             | 84,174        | 1,828          |
| Chain                  | 84,174        | 1,828          |
| Classic Vest, L        | 84,174        | 1,828          |
| Classic Vest, M        | 84,174        | 1,828          |
| Classic Vest, S        | 84,174        | 1,828          |
| Fender Set - Mountain  | 84,174        | 1,828          |
| <b>Total</b>           | <b>84,174</b> | <b>1,828</b>   |

## WHAT IS A DATA MODEL?



This **IS** a data model! 😊

- The tables are connected via relationships, based on a common field (Product Key)
- Now **Sales** and **Returns** data can be filtered using fields from the **Product Lookup** table!

| ProductName            | OrderQuantity | ReturnQuantity |
|------------------------|---------------|----------------|
| All-Purpose Bike Stand | 234           | 8              |
| AWC Logo Cap           | 4,151         | 46             |
| Bike Wash - Dissolver  | 1,706         | 25             |
| Classic Vest, L        | 182           | 4              |
| Classic Vest, M        | 182           | 7              |
| Classic Vest, S        | 157           | 8              |
| Fender Set - Mountain  | 3,960         | 54             |
| Half-Finger Gloves, L  | 840           | 18             |
| Half-Finger Gloves, M  | 918           | 16             |
| <b>Total</b>           | <b>84,174</b> | <b>1,828</b>   |

# DATABASE NORMALIZATION

**Normalization** is the process of organizing the tables and columns in a relational database to reduce redundancy and preserve data integrity. It's commonly used to:

- **Eliminate redundant data** to decrease table sizes and improve processing speed & efficiency
- **Minimize errors and anomalies** from data modifications (inserting, updating or deleting records)
- **Simplify queries** and structure the database for meaningful analysis



In a normalized database, each table should serve a **distinct** and **specific** purpose (i.e. *product information, transaction records, customer attributes, store details, etc.*)

| date     | product_id | quantity | product_brand | product_name                | product_sku | product_weight |
|----------|------------|----------|---------------|-----------------------------|-------------|----------------|
| 1/1/1997 | 869        | 5        | Nationeel     | Nationeel Grape Fruit Roll  | 52382137179 | 17             |
| 1/7/1997 | 869        | 2        | Nationeel     | Nationeel Grape Fruit Roll  | 52382137179 | 17             |
| 1/3/1997 | 1          | 4        | Washington    | Washington Berry Juice      | 90748583674 | 8.39           |
| 1/1/1997 | 1472       | 3        | Fort West     | Fort West Fudge Cookies     | 37276054024 | 8.28           |
| 1/6/1997 | 1472       | 2        | Fort West     | Fort West Fudge Cookies     | 37276054024 | 8.28           |
| 1/5/1997 | 2          | 4        | Washington    | Washington Mango Drink      | 96516502499 | 7.42           |
| 1/1/1997 | 76         | 4        | Red Spade     | Red Spade Sliced Chicken    | 62054644227 | 18.1           |
| 1/1/1997 | 76         | 2        | Red Spade     | Red Spade Sliced Chicken    | 62054644227 | 18.1           |
| 1/5/1997 | 3          | 2        | Washington    | Washington Strawberry Drink | 58427771925 | 13.1           |
| 1/7/1997 | 3          | 2        | Washington    | Washington Strawberry Drink | 58427771925 | 13.1           |
| 1/1/1997 | 320        | 3        | Excellent     | Excellent Cranberry Juice   | 36570182442 | 16.4           |

Models that aren't normalized contain **redundant, duplicate data**. In this case, all of the product-specific fields could be stored in a separate table containing a unique record for each **product id**

This may not seem critical now, but minor inefficiencies can become major problems at scale!

## FACT & DIMENSION TABLES

Data models generally contain two types of tables: **fact** ("data") tables, and **dimension** ("lookup") tables:

- **Fact tables** contain **numerical values** or metrics used for summarization (*sales, orders, transactions, pageviews, etc.*)
- **Dimension tables** contain **descriptive attributes** used for filtering or grouping (*products, customers, dates, stores, etc.*)

| date     | product_id | quantity |
|----------|------------|----------|
| 1/1/1997 | 869        | 5        |
| 1/1/1997 | 1472       | 3        |
| 1/1/1997 | 76         | 4        |
| 1/1/1997 | 320        | 3        |
| 1/1/1997 | 4          | 4        |
| 1/1/1997 | 952        | 4        |
| 1/1/1997 | 1222       | 4        |
| 1/1/1997 | 517        | 4        |
| 1/1/1997 | 1359       | 4        |
| 1/1/1997 | 357        | 4        |
| 1/1/1997 | 1426       | 5        |
| 1/1/1997 | 190        | 4        |
| 1/1/1997 | 367        | 4        |
| 1/1/1997 | 250        | 5        |
| 1/1/1997 | 600        | 4        |
| 1/1/1997 | 702        | 5        |

This **Fact** table contains **quantity** values, along with **date** and **product\_id** fields

| date     | day_of_month | month | year | weekday   | week_of_year | week_ending | month_name | quarter |
|----------|--------------|-------|------|-----------|--------------|-------------|------------|---------|
| 1/1/1997 | 1            | 1     | 1997 | Wednesday | 1            | 1/5/1997    | January    | Q1      |
| 1/2/1997 | 2            | 1     | 1997 | Thursday  | 1            | 1/5/1997    | January    | Q1      |
| 1/3/1997 | 3            | 1     | 1997 | Friday    | 1            | 1/5/1997    | January    | Q1      |
| 1/4/1997 | 4            | 1     | 1997 | Saturday  | 1            | 1/5/1997    | January    | Q1      |
| 1/5/1997 | 5            | 1     | 1997 | Sunday    | 2            | 1/5/1997    | January    | Q1      |
| 1/6/1997 | 6            | 1     | 1997 | Monday    | 2            | 1/12/1997   | January    | Q1      |

This **Calendar Lookup** table contains attributes about each **date** (month, year, quarter, etc.)

| product_id | product_brand | product_name                | product_sku | product_retail_price | product_cost | product_weight |
|------------|---------------|-----------------------------|-------------|----------------------|--------------|----------------|
| 1          | Washington    | Washington Berry Juice      | 90748583674 | 2.85                 | 0.94         | 8.39           |
| 2          | Washington    | Washington Mango Drink      | 96516502499 | 0.74                 | 0.26         | 7.42           |
| 3          | Washington    | Washington Strawberry Drink | 58427771925 | 0.83                 | 0.4          | 13.1           |
| 4          | Washington    | Washington Cream Soda       | 64412155747 | 3.64                 | 1.64         | 10.6           |
| 5          | Washington    | Washington Diet Soda        | 85561191439 | 2.19                 | 0.77         | 6.66           |
| 6          | Washington    | Washington Cola             | 29804642796 | 1.15                 | 0.37         | 15.8           |
| 7          | Washington    | Washington Diet Cola        | 20191444754 | 2.61                 | 0.91         | 18             |
| 8          | Washington    | Washington Orange Juice     | 89770532250 | 2.59                 | 0.8          | 8.97           |

This **Product Lookup** table contains attributes about each **product\_id** (brand, SKU, price, etc.)

# PRIMARY & FOREIGN KEYS

| date     | product_id | quantity |
|----------|------------|----------|
| 1/1/1997 | 869        | 5        |
| 1/1/1997 | 1472       | 3        |
| 1/1/1997 | 76         | 4        |
| 1/1/1997 | 320        | 3        |
| 1/1/1997 | 4          | 4        |
| 1/1/1997 | 952        | 4        |
| 1/1/1997 | 1222       | 4        |
| 1/1/1997 | 517        | 4        |
| 1/1/1997 | 1359       | 4        |
| 1/1/1997 | 357        | 4        |
| 1/1/1997 | 1426       | 5        |
| 1/1/1997 | 190        | 4        |
| 1/1/1997 | 367        | 4        |
| 1/1/1997 | 250        | 5        |
| 1/1/1997 | 600        | 4        |
| 1/1/1997 | 702        | 5        |

| date     | day_of_month | month | year | weekday   | week_of_year | week_ending | month_name | quarter |
|----------|--------------|-------|------|-----------|--------------|-------------|------------|---------|
| 1/1/1997 | 1            | 1     | 1997 | Wednesday | 1            | 1/5/1997    | January    | Q1      |
| 1/2/1997 | 2            | 1     | 1997 | Thursday  | 1            | 1/5/1997    | January    | Q1      |
| 1/3/1997 | 3            | 1     | 1997 | Friday    | 1            | 1/5/1997    | January    | Q1      |
| 1/4/1997 | 4            | 1     | 1997 | Saturday  | 1            | 1/5/1997    | January    | Q1      |
| 1/5/1997 | 5            | 1     | 1997 | Sunday    | 2            | 1/5/1997    | January    | Q1      |
| 1/6/1997 | 6            | 1     | 1997 | Monday    | 2            | 1/12/1997   | January    | Q1      |

| product_id | product_brand | product_name                | product_sku | product_retail_price | product_cost | product_weight |
|------------|---------------|-----------------------------|-------------|----------------------|--------------|----------------|
| 1          | Washington    | Washington Berry Juice      | 90748583674 | 2.85                 | 0.94         | 8.39           |
| 2          | Washington    | Washington Mango Drink      | 96516502499 | 0.74                 | 0.26         | 7.42           |
| 3          | Washington    | Washington Strawberry Drink | 58427771925 | 0.83                 | 0.4          | 13.1           |
| 4          | Washington    | Washington Cream Soda       | 64412155747 | 3.64                 | 1.64         | 10.6           |
| 5          | Washington    | Washington Diet Soda        | 85561191439 | 2.19                 | 0.77         | 6.66           |
| 6          | Washington    | Washington Cola             | 29804642796 | 1.15                 | 0.37         | 15.8           |
| 7          | Washington    | Washington Diet Cola        | 20191444754 | 2.61                 | 0.91         | 18             |
| 8          | Washington    | Washington Orange Juice     | 89770532250 | 2.59                 | 0.8          | 8.97           |

These are **foreign keys (FK)**

They contain multiple instances of each value, and relate to **primary keys** in dimension tables

These are **primary keys (PK)**

They uniquely identify each row of the table, and relate to **foreign keys** in fact tables

# RELATIONSHIPS VS. MERGED TABLES



Can't I just merge queries or use lookup functions to **pull everything into one single table**?

- Anonymous confused man

| date     | product_id | quantity |
|----------|------------|----------|
| 1/1/1997 | 869        | 5        |
| 1/7/1997 | 869        | 2        |
| 1/3/1997 | 1          | 4        |
| 1/1/1997 | 1472       | 3        |
| 1/6/1997 | 1472       | 2        |
| 1/5/1997 | 2          | 4        |
| 1/1/1997 | 76         | 4        |
| 1/1/1997 | 76         | 2        |
| 1/5/1997 | 3          | 2        |
| 1/7/1997 | 3          | 2        |
| 1/1/1997 | 320        | 3        |

| day_of_month | month | year | weekday   | month_name | quarter |
|--------------|-------|------|-----------|------------|---------|
| 1            | 1     | 1997 | Wednesday | January    | Q1      |
| 2            | 1     | 1997 | Thursday  | January    | Q1      |
| 3            | 1     | 1997 | Friday    | January    | Q1      |
| 4            | 1     | 1997 | Saturday  | January    | Q1      |
| 5            | 1     | 1997 | Sunday    | January    | Q1      |
| 6            | 1     | 1997 | Monday    | January    | Q1      |
| 1            | 1     | 1997 | Wednesday | January    | Q1      |
| 2            | 1     | 1997 | Thursday  | January    | Q1      |
| 3            | 1     | 1997 | Friday    | January    | Q1      |
| 7            | 1     | 1997 | Tuesday   | January    | Q1      |
| 1            | 1     | 1997 | Wednesday | January    | Q1      |

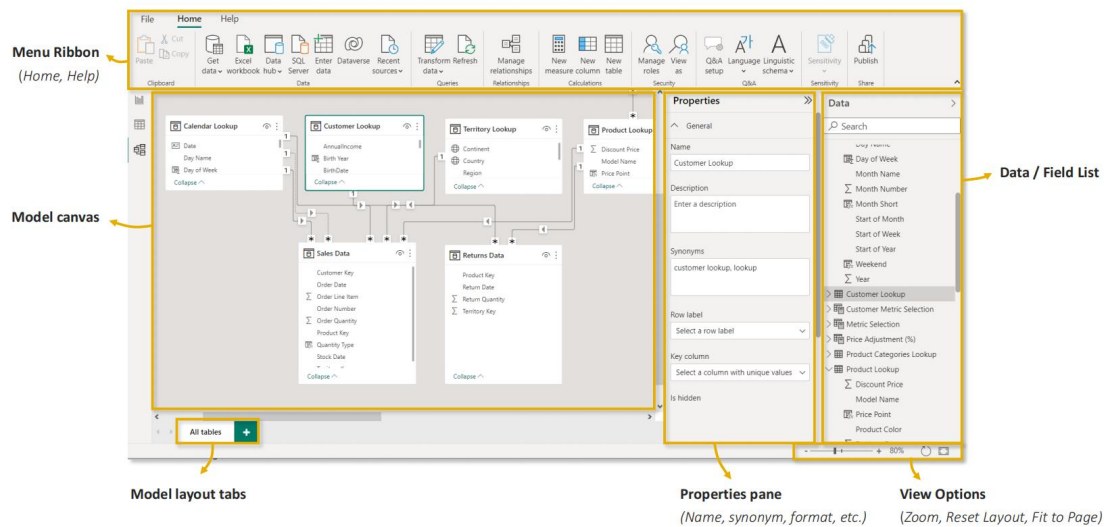
  

| product_brand | product_name                | product_sku | product_weight |
|---------------|-----------------------------|-------------|----------------|
| Nationeel     | Nationeel Grape Fruit Roll  | 52382137179 | 17             |
| Washington    | Washington Berry Juice      | 90748583674 | 8.39           |
| Fort West     | Fort West Fudge Cookies     | 37276054024 | 8.28           |
| Fort West     | Fort West Mango Drink       | 96516502499 | 7.42           |
| Red Spade     | Red Spade Sliced Chicken    | 62054644227 | 18.1           |
| Washington    | Washington Strawberry Drink | 58427771925 | 13.1           |
| Excellent     | Excellent Cranberry Juice   | 36570182442 | 16.4           |

You can, **but it's extremely inefficient!**

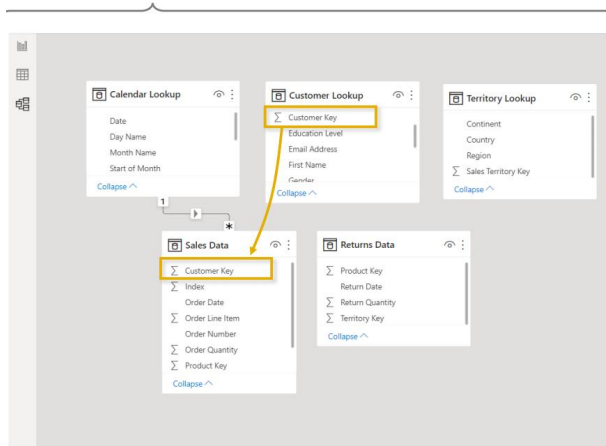
- Merging tables creates **redundancy** and often requires **significantly more memory and processing power** to analyze compared to a relational model with multiple small tables

# THE MODEL VIEW

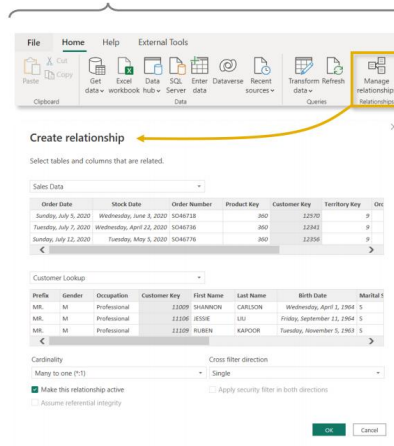


## CREATING TABLE RELATIONSHIPS

**OPTION 1:** Click and drag to connect primary and foreign keys within the **Model** view



**OPTION 2:** Add or detect relationships using the **Manage Relationships** dialog box





## MANAGING & EDITING RELATIONSHIPS

The image shows two screenshots from the Power BI Desktop interface. The left screenshot shows the 'Manage relationships' dialog box, which lists active and inactive relationships between tables. The 'Edit...' button is highlighted with a yellow box. The right screenshot shows the 'Edit relationship' dialog box, which allows users to select tables and columns that are related, set cardinality, and filter direction. The 'Make this relationship active' checkbox is checked.

**Manage relationships**

| Active                              | From: Table (Column)                                | To: Table (Column)                                     |
|-------------------------------------|---|--|
| <input checked="" type="checkbox"/> | Product Lookup (Product Subcategory Key)            | Product Subcategories Lookup (Product Subcategory Key) |
| <input checked="" type="checkbox"/> | Product Subcategories Lookup (Product Category Key) | Product Categories Lookup (Product Category Key)       |
| <input checked="" type="checkbox"/> | Sales Data (Customer Key)                           | Customer Lookup (Customer Key)                         |
| <input checked="" type="checkbox"/> | Sales Data (Order Date)                             | Calendar Lookup (Date)                                 |
| <input checked="" type="checkbox"/> | Sales Data (Product Key)                            | Product Lookup (Product Key)                           |

**Edit relationship**

Select tables and columns that are related.

Sales Data

| Order Date            | Stock Date                | Order Number | Product Key | Customer Key | Territory Key | On |
|-----------------------|---------------------------|--------------|-------------|--------------|---------------|----|
| Sunday, July 5, 2020  | Wednesday, June 3, 2020   | 5046718      |             | 360          | 12570         | 9  |
| Tuesday, July 7, 2020 | Wednesday, April 22, 2020 | 5046736      |             | 360          | 12341         | 9  |
| Sunday, July 12, 2020 | Tuesday, May 5, 2020      | 5046776      |             | 360          | 12356         | 9  |

Customer Lookup

| Prefix | Gender | Occupation   | Customer Key | First Name | Last Name | Birth Date                 | Marital S |
|--------|--------|--------------|--------------|------------|-----------|----------------------------|-----------|
| MR.    | M      | Professional | 11109        | SHANNON    | CARLSON   | Wednesday, April 1, 1964   | 5         |
| MR.    | M      | Professional | 11106        | JESSIE     | LIU       | Friday, September 11, 1964 | 5         |
| MR.    | M      | Professional | 11109        | RUBEN      | KAPOOR    | Tuesday, November 5, 1969  | 5         |

Cardinality: Many to one (\*:1)

Cross filter direction: Single

☒ Make this relationship active

☐ Assume referential integrity

☐ Apply security filter in both directions

OK Cancel

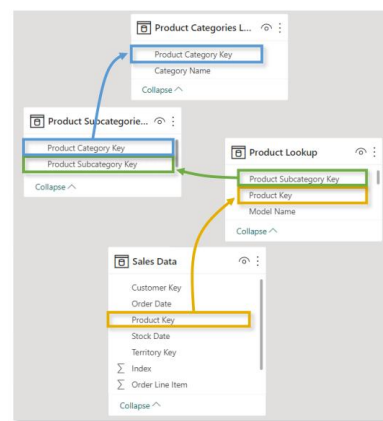
Launch the **Manage Relationships** dialog box or double-click a relationship to modify it

Editing tools allow you to **activate or deactivate** relationships and manage **cardinality** and **filter direction** – more on that soon!

## STAR & SNOWFLAKE SCHEMAS





A **star schema** is the simplest and most common type of data model, characterized by a single fact table surrounded by related dimension tables



A **snowflake schema** is an extension of a star, and includes relationships between dimension tables and related sub-dimension tables

# ASSIGNMENT: TABLE RELATIONSHIPS





NEW MESSAGE

From: Dana Modelle (Analyst)

Subject: Need a favor...

Hey there,

Ethan shared the data model you've been working on, and we might have an issue...

Last night I left my laptop open, and my cat Dennis somehow got his paws on our model. Now all the relationships are gone!

Could you please rebuild the model, including all three product tables? I owe you one!

-Dana


Reply


Forward

## Key Objectives

1. Delete all existing table relationships
2. Create a star schema by creating relationships between the Sales, Calendar, Customer, Product and Territories tables
3. Connect all three product tables (Product, Subcategory, Category) in a snowflake schema
4. Use the matrix visual to confirm that you can filter Order Quantity values using fields from each dimension table

# SOLUTION: TABLE RELATIONSHIPS





NEW MESSAGE

From: Dana Modelle (Analyst)

Subject: Need a favor...

Hey there,

Ethan shared the data model you've been working on, and we might have an issue...

Last night I left my laptop open, and my cat Dennis somehow got his paws on our model. Now all the relationships are gone!

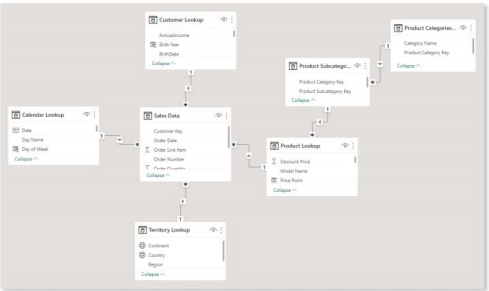
Could you please rebuild the model, including all three product tables? I owe you one!

-Dana

Reply

Forward

## Solution Preview



## PRO TIP: ACTIVE & INACTIVE RELATIONSHIPS



The screenshot shows the relationship between the Calendar and Sales Data tables. The Calendar table has a Date key. The Sales Data table has Order Date and Stock Date columns. The relationship is set to active.

**Edit relationship**

Select tables and columns that are related.

| Sales Data | Order Date | Stock Date | Order Number | Product Key | Customer Key | Territory Key | Order Line Item |
|------------|------------|------------|--------------|-------------|--------------|---------------|-----------------|
| 7/5/2020   | 6/1/2020   | 5/4/2018   | 380          | 12570       | 9            | 2             | 1               |
| 7/7/2020   | 4/22/2020  | 5/4/2018   | 380          | 12342       | 9            | 2             | 1               |
| 7/12/2020  | 5/5/2020   | 5/4/2018   | 380          | 12356       | 9            | 2             | 1               |

**Calendar Lookup**

| Date     | Day Name  | Start of Week | Start of Month | Month Name | Start of Year | Year |
|----------|-----------|---------------|----------------|------------|---------------|------|
| 1/1/2020 | Wednesday | 12/29/2019    | 1/1/2020       | January    | 1/1/2020      | 2020 |
| 1/2/2020 | Thursday  | 12/29/2019    | 1/1/2020       | January    | 1/2/2020      | 2020 |
| 1/3/2020 | Friday    | 12/29/2019    | 1/1/2020       | January    | 1/3/2020      | 2020 |

Cardinality: Many to one (\*:1)

Cross filter direction: Single

☒ Make this relationship active

**Properties**

Relationship

Table: Sales Data, Column: Order Date

Cardinality: Many to one (\*:1)

Table: Calendar Lookup, Column: Date

☒ Make this relationship active

Cross filter direction: Single

The **Sales Data** table contains two date fields (**Order Date** & **Stock Date**), but there can only be **one active relationship** to the Date key in the Calendar table

You can set relationships to active or inactive from either the **Edit Relationships** dialog box or the **Properties** (you must deactivate one before activating another)

## PRO TIP: ACTIVE & INACTIVE RELATIONSHIPS



The screenshot shows the relationship between the Calendar and Sales Data tables. The Calendar table has a Date key. The Sales Data table has Order Date and Stock Date columns. The relationship is set to inactive.

**Edit relationship**

Select tables and columns that are related.

| Sales Data | Order Date | Stock Date | Order Number | Product Key | Customer Key | Territory Key | Order Line Item |
|------------|------------|------------|--------------|-------------|--------------|---------------|-----------------|
| 7/5/2020   | 6/1/2020   | 5/4/2018   | 380          | 12570       | 9            | 2             | 1               |
| 7/7/2020   | 4/22/2020  | 5/4/2018   | 380          | 12342       | 9            | 2             | 1               |
| 7/12/2020  | 5/5/2020   | 5/4/2018   | 380          | 12356       | 9            | 2             | 1               |

**Calendar Lookup**

| Date     | Day Name  | Start of Week | Start of Month | Month Name | Start of Year | Year |
|----------|-----------|---------------|----------------|------------|---------------|------|
| 1/1/2020 | Wednesday | 12/29/2019    | 1/1/2020       | January    | 1/1/2020      | 2020 |
| 1/2/2020 | Thursday  | 12/29/2019    | 1/1/2020       | January    | 1/2/2020      | 2020 |
| 1/3/2020 | Friday    | 12/29/2019    | 1/1/2020       | January    | 1/3/2020      | 2020 |

Cardinality: Many to one (\*:1)

Cross filter direction: Single

☐ Make this relationship active

**Properties**

Relationship

Table: Sales Data, Column: Stock Date

Cardinality: Many to one (\*:1)

Table: Calendar Lookup, Column: Date

☐ Make this relationship active

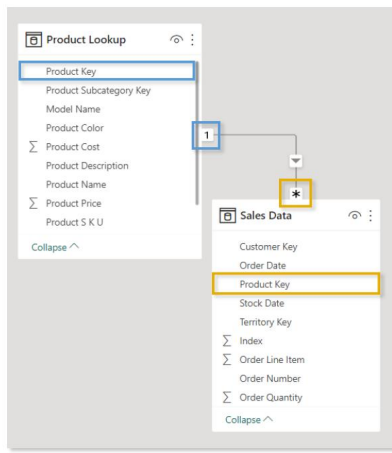
Cross filter direction: Single

The **Sales Data** table contains two date fields (**Order Date** & **Stock Date**), but there can only be **one active relationship** to the Date key in the Calendar table

You can set relationships to active or inactive from either the **Edit Relationships** dialog box or the **Properties** (you must deactivate one before activating another)



## RELATIONSHIP CARDINALITY



**Cardinality** refers to the uniqueness of values in a column

- Ideally, all relationships in the data model should follow a **one-to-many** cardinality: **one** instance of each primary key, and **many** instances of each foreign key

In this example there is only **ONE instance of each Product Key** in the Product table (noted by a "1"), since each row contains **attributes of a single product** (name, SKU, description, price, etc.)

There are **MANY instances of each Product Key** in the Sales table (noted by an asterisk \*), since there are **multiple sales for each product**

## EXAMPLE: MANY-TO-MANY CARDINALITY

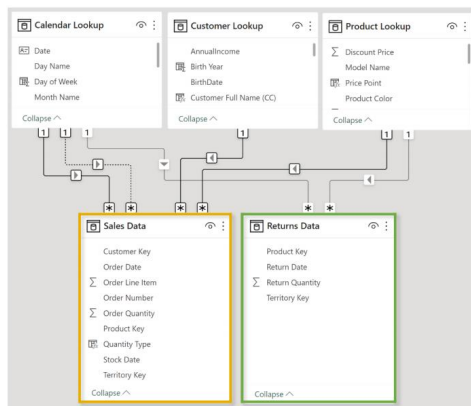
| product_id | product_name               | product_sku |
|------------|----------------------------|-------------|
| 4          | Washington Cream Soda      | 64412155747 |
| 4          | Washington Diet Cream Soda | 81727382373 |
| 5          | Washington Diet Soda       | 85561191439 |
| 7          | Washington Diet Cola       | 20191444754 |
| 8          | Washington Orange Juice    | 89770532250 |

| date     | product_id | transactions |
|----------|------------|--------------|
| 1/1/2017 | 4          | 12           |
| 1/2/2017 | 4          | 9            |
| 1/3/2017 | 4          | 11           |
| 1/1/2017 | 5          | 16           |
| 1/2/2017 | 5          | 19           |
| 1/1/2017 | 7          | 11           |

⚠ This relationship has cardinality Many-Many. This should only be used if it is expected that neither column (product\_id and product\_id) contains unique values, and that the significantly different behavior of Many-many relationships is understood. [Learn more](#)

- If we try to connect the tables above using **product\_id**, we'll get a **many-to-many relationship** warning since there are multiple instances of product\_id in both tables
- Even if we force this relationship, how would we know which product was actually sold on each date – **Cream Soda** or **Diet Cream Soda**?

## CONNECTING MULTIPLE FACT TABLES



This model contains two fact tables: **Sales Data** and **Returns Data**

- Since there is no primary/foreign key relationship, we can't connect them directly to each other
- But we *can* connect each fact table to related lookups, which allows us to filter both sales and returns data **using fields from any shared lookup tables**
- We can view orders and returns by product since both tables relate to Product Lookup, but we can't view returns by customer since no relationship exists



### HEY THIS IS IMPORTANT!

Generally speaking, fact tables should **connect through shared dimension tables, not directly to each other**