



Analyzing Data with Microsoft Power BI

Exam Ref DA-100

Daniil Maslyuk

FREE SAMPLE CHAPTER

SHARE WITH OTHERS



Exam Ref DA-100 Analyzing Data with Microsoft Power BI

Daniil Maslyuk

Exam Ref DA-100 Analyzing Data with Microsoft Power BI

Published with the authorization of Microsoft Corporation by:
Pearson Education, Inc.
Hoboken, New Jersey

Copyright © 2021 by Pearson Education, Inc.

All rights reserved. This publication is protected by copyright, and permission must be obtained from the publisher prior to any prohibited reproduction, storage in a retrieval system, or transmission in any form or by any means, electronic, mechanical, photocopying, recording, or likewise. For information regarding permissions, request forms, and the appropriate contacts within the Pearson Education Global Rights & Permissions Department, please visit www.pearson.com/permissions.

No patent liability is assumed with respect to the use of the information contained herein. Although every precaution has been taken in the preparation of this book, the publisher and author assume no responsibility for errors or omissions. Nor is any liability assumed for damages resulting from the use of the information contained herein.

ISBN-13: 978-0-13-681968-4

ISBN-10: 0-13-681968-0

Library of Congress Control Number: 2021935778

ScoutAutomatedPrintCode

TRADEMARKS

Microsoft and the trademarks listed at <http://www.microsoft.com> on the “Trademarks” webpage are trademarks of the Microsoft group of companies. All other marks are property of their respective owners.

WARNING AND DISCLAIMER

Every effort has been made to make this book as complete and as accurate as possible, but no warranty or fitness is implied. The information provided is on an “as is” basis. The author, the publisher, and Microsoft Corporation shall have neither liability nor responsibility to any person or entity with respect to any loss or damages arising from the information contained in this book or from the use of the programs accompanying it.

SPECIAL SALES

For information about buying this title in bulk quantities, or for special sales opportunities (which may include electronic versions; custom cover designs; and content particular to your business, training goals, marketing focus, or branding interests), please contact our corporate sales department at corpsales@pearsoned.com or (800) 382-3419.

For government sales inquiries, please contact governmentsales@pearsoned.com.

For questions about sales outside the U.S., please contact intlcs@pearson.com.

CREDITS

EDITOR-IN-CHIEF
Brett Bartow

EXECUTIVE EDITOR
Loretta Yates

DEVELOPMENT EDITOR
Songlin Qiu

SPONSORING EDITOR
Charvi Arora

MANAGING EDITORS
Sandra Schroeder

SENIOR PROJECT EDITOR
Tracey Croom

COPY EDITOR
Liz Welch

INDEXER
Timothy Wright

PROOFREADER
Betty Pessagno

TECHNICAL EDITOR
Claire Mitchell, Owen Auger

EDITORIAL ASSISTANT
Cindy Teeters

COVER DESIGNER
Twist Creative, Seattle

COMPOSITOR
codeMantra

*To Dasha, Leonard, and William, who served as a great source of
motivation and support.*

—DANIIL MASLYUK

This page intentionally left blank

Contents at a glance

	<i>Introduction</i>	<i>xiv</i>
CHAPTER 1	Prepare the data	1
CHAPTER 2	Model the data	67
CHAPTER 3	Visualize the data	141
CHAPTER 4	Analyze the data	201
CHAPTER 5	Deploy and maintain deliverables	229
	<i>Index</i>	<i>263</i>

This page intentionally left blank

Contents

Introduction	xiv
<i>Organization of this book</i>	<i>xiv</i>
<i>Preparing for the exam</i>	<i>xiv</i>
<i>Microsoft certifications</i>	<i>xv</i>
<i>Companion files</i>	<i>xv</i>
<i>Quick access to online references</i>	<i>xvi</i>
<i>Errata, updates, & book support</i>	<i>xvi</i>
<i>Stay in touch</i>	<i>xvi</i>
Chapter 1 Prepare the data	1
Skill 1.1: Get data from different data sources	1
Identify and connect to a data source	2
Change data source settings	6
Select a shared dataset or create a local dataset	7
Select a storage mode	9
Choose an appropriate query type	12
Identify query performance issues	15
Use Microsoft Dataverse	18
Use parameters	19
Use or create a PBIDS file	24
Use or create a dataflow	25
Connect to a dataset by using the XMLA endpoint	26
Skill 1.2: Profile the data	27
Identify data anomalies	27
Examine data structures and interrogate column properties	28
Interrogate data statistics	30
Skill 1.3: Clean, transform, and load the data	31
Resolve inconsistencies, unexpected or null values, and data quality issues and apply user-friendly value replacements	32
Evaluate and transform column data types	35
Identify and create appropriate keys for joins	38

Apply data shape transformations to table structures	40
Combine queries	50
Apply user-friendly naming conventions to columns and queries	55
Leverage the Advanced Editor to modify Power Query M code	55
Configure data loading	58
Resolve data import errors	59
Chapter summary	61
Thought experiment.....	62
Thought experiment answers	64

Chapter 2 Model the data 67

Skill 2.1: Design a data model.....	67
Define the tables	68
Configure table and column properties	71
Define quick measures	73
Flatten out a parent-child hierarchy	76
Define role-playing dimensions	79
Define a relationship's cardinality and cross-filter direction	82
Design the data model to meet performance requirements	86
Resolve many-to-many relationships	87
Create a common date table	91
Define the appropriate level of data granularity	94
Skill 2.2: Develop a data model.....	96
Apply cross-filter direction and security filtering	97
Create calculated tables	97
Create hierarchies	99
Create calculated columns	100
Implement row-level security roles	102
Set up the Q&A feature	108
Skill 2.3: Create measures by using DAX.....	113
Use DAX to build complex measures	113
Use CALCULATE to manipulate filters	116
Implement Time Intelligence using DAX	122

Replace numeric columns with measures	124
Use basic statistical functions to enhance data	125
Create semi-additive measures	125
Skill 2.4: Optimize model performance	128
Remove unnecessary rows and columns	128
Identify poorly performing measures, relationships, and visuals	129
Improve cardinality levels by changing data types	130
Improve cardinality levels through summarization	131
Create and manage aggregations	131
Chapter summary	133
Thought experiment	135
Thought experiment answers	138

Chapter 3 Visualize the data 141

Skill 3.1: Create reports	141
Add visualization items to reports	142
Choose an appropriate visualization type	143
Format and configure visualizations	154
Import a custom visual	155
Configure conditional formatting	156
Apply slicing and filtering	158
Add an R or Python visual	161
Configure the report page	164
Design and configure for accessibility	165
Configure automatic page refresh	168
Create a paginated report	170
Skill 3.2: Create dashboards	172
Manage tiles on a dashboard	172
Set mobile view	174
Configure data alerts	176
Use the Q&A feature	177
Add a dashboard theme	178
Pin a live report page to a dashboard	179

Skill 3.3: Enrich reports for usability	180
Configure bookmarks	180
Create custom tooltips	183
Edit and configure interactions between visuals	185
Configure navigation for a report	186
Apply sorting	187
Configure Sync slicers	188
Use the Selection pane	190
Use drill-through and cross-filter	191
Drill down into data using interactive visuals	193
Export report data	194
Design reports for mobile devices	195
Chapter summary	196
Thought experiment	198
Thought experiment answers	199

Chapter 4 Analyze the data 201

Skill 4.1: Enhance reports to expose insights	201
Apply conditional formatting	202
Perform top N analysis	206
Explore statistical summary	208
Add a Quick Insights result to a dashboard	210
Create reference lines by using the Analytics pane	211
Use the Play Axis feature of a visualization and conduct time-series analysis	212
Personalize visuals	214
Skill 4.2: Perform advanced analysis	215
Identify outliers	215
Use groupings and binnings	217
Use the Key influencers to explore dimensional variances	219
Use the Decomposition tree visual to break down a measure	222
Apply AI Insights	223
Chapter summary	224
Thought experiment	225
Thought experiment answers	227

Chapter 5	Deploy and maintain deliverables	229
	Skill 5.1: Manage datasets	229
	Configure a dataset scheduled refresh	230
	Configure row-level security group membership	232
	Provide access to datasets	235
	Configure incremental refresh settings	238
	Promote or certify Power BI content	242
	Configure large dataset format	244
	Skill 5.2: Create and manage workspaces	246
	Create and configure a workspace	246
	Recommend a development lifecycle strategy	248
	Assign workspace roles	250
	Configure and update a workspace app	251
	Publish, import, or update assets in a workspace	255
	Apply sensitivity labels to workspace content	256
	Configure subscriptions	257
	Chapter summary	259
	Thought experiment	261
	Thought experiment answers	262
	<i>Index</i>	263

Acknowledgments

I would like to thank Loretta Yates for trusting me to write the second Power BI exam reference book, Charvi Arora for managing the project, Tracey Croom for managing the production, and everyone else at Pearson who worked on this book to make it happen. Also, I'd like to thank both technical editors, Claire Mitchell and Owen Auger, who checked the book for accuracy and helped reduce the number of errors.

A few people have contributed to my becoming a fan of Power BI. Gabriel Polo Reyes was instrumental in my being introduced to the world of Microsoft BI. Thomas van Vliet, my first client, hired me despite my having no prior commercial experience with Power BI and fed me many problems that led to my mastering Power BI.

About the author



DANIIL MASLYUK is an independent business intelligence consultant, trainer, and speaker who specializes in Microsoft Power BI. Daniil blogs at xxlbi.com and tweets as [@DMaslyuk](https://twitter.com/DMaslyuk).

Introduction

Exam DA-100: Analyzing Data with Microsoft Power BI, focuses on using Microsoft Power BI for data analysis. About one-fourth of the exam covers data preparation, which includes getting data from different data sources, and profiling, cleaning, transforming, and loading the data. Approximately 30 percent of the questions are related to data modeling: designing, developing, and optimizing a data model. Almost one-third of the book covers the skills necessary to visualize and analyze data, such as creating reports and dashboards, as well as performing advanced analysis. The remainder of the book discusses how to manage datasets and workspaces in the Power BI service.

The DA-100 exam is intended for business intelligence professionals, data analysts, and report creators who are seeking to validate their skills and knowledge in analyzing data with Power BI. Candidates should be familiar with how to get, model, and visualize data in Power BI Desktop, as well as share reports with other people.

This book covers every major topic area found on the exam, but it does not cover every exam question. Only the Microsoft exam team has access to the exam questions, and Microsoft regularly adds new questions to the exam, making it impossible to cover specific questions. You should consider this book a supplement to your relevant real-world experience and other study materials. If you encounter a topic in this book that you do not feel completely comfortable with, use the “Need more review?” links you’ll find in the text to find more information and take the time to research and study the topic. Great information is available on MSDN, on TechNet, and in blogs and forums.

Organization of this book

This book is organized by the “Skills measured” list published for the exam. The “Skills measured” list is available for each exam on the Microsoft Learn website: <http://aka.ms/examlist>. Each chapter in this book corresponds to a major topic area in the list, and the technical tasks in each topic area determine a chapter’s organization. If an exam covers six major topic areas, for example, the book will contain six chapters.

Preparing for the exam

Microsoft certification exams are a great way to build your résumé and let the world know about your level of expertise. Certification exams validate your on-the-job experience and product knowledge. Although there is no substitute for on-the-job experience, preparation

through study and hands-on practice can help you prepare for the exam. This book is *not* designed to teach you new skills.

We recommend that you augment your exam preparation plan by using a combination of available study materials and courses. For example, you might use the Exam Ref and another study guide for your “at home” preparation and take a Microsoft Official Curriculum course for the classroom experience. Choose the combination that you think works best for you. Learn more about available classroom training and find free online courses and live events at <http://microsoft.com/learn>. Microsoft Official Practice Tests are available for many exams at <http://aka.ms/practicetests>.

Note that this Exam Ref is based on publicly available information about the exam and the author’s experience. To safeguard the integrity of the exam, authors do not have access to the live exam.

Microsoft certifications

Microsoft certifications distinguish you by proving your command of a broad set of skills and experience with current Microsoft products and technologies. The exams and corresponding certifications are developed to validate your mastery of critical competencies as you design and develop, or implement and support, solutions with Microsoft products and technologies both on-premises and in the cloud. Certification brings a variety of benefits to the individual and to employers and organizations.

MORE INFO ALL MICROSOFT CERTIFICATIONS

For information about Microsoft certifications, including a full list of available certifications, go to www.microsoft.com/learn.

Check back often to see what is new!

Companion files

Most of the chapters in this book include exercises that let you interactively try out new material learned in the main text. All files can be downloaded from the following page:

MicrosoftPressStore.com/ExamRefDA100PowerBI/downloads

There are two kinds of files:

1. Source files, required to work in Power Query Editor:
 - The Targets folder

- Inventory.xlsx
 - WideWorldImporters.xlsx
2. The Power BI files folder, containing completed PBIX files.

All exercises assume you extracted the companion files to the C:\DA-100 folder.

Quick access to online references

Throughout this book are addresses to webpages that the author has recommended you visit for more information. Some of these links can be very long and painstaking to type, so we've shortened them for you to make them easier to visit. We've also compiled them into a single list that readers of the print edition can refer to while they read.

Download the list at *MicrosoftPressStore.com/ExamRefDA100PowerBI/downloads*.

The URLs are organized by chapter and heading. Every time you come across a URL in the book, find the hyperlink in the list to go directly to the webpage.

Errata, updates, & book support

We've made every effort to ensure the accuracy of this book and its companion content. You can access updates to this book—in the form of a list of submitted errata and their related corrections—at:

MicrosoftPressStore.com/ExamRefDA100PowerBI/errata

If you discover an error that is not already listed, please submit it to us at the same page.

For additional book support and information, please visit
www.MicrosoftPressStore.com/Support.

Please note that product support for Microsoft software and hardware is not offered through the previous addresses. For help with Microsoft software or hardware, go to *http://support.microsoft.com*.

Stay in touch

Let's keep the conversation going! We're on Twitter: *http://twitter.com/MicrosoftPress*.

Model the data

In the previous chapter, we reviewed the skills necessary to get and transform data by using Power Query Editor—the process also known as *data shaping*. In this chapter, we explore the skills needed to model data.

Power BI allows you to analyze your data to some degree right after you load it, but a strong understanding of data modeling helps you perform sophisticated analysis using rich data modeling capabilities, which includes creating relationships, hierarchies, and various calculations to bring out the true power of Power BI. In Chapter 1, “Prepare the data,” in Power Query Editor we used the M language; once we loaded the data into the model, we used data analysis expressions, more commonly referred to as DAX, Power BI’s native query language.

In this chapter, we discuss the skills necessary to design, develop, and optimize data models. Additionally, we look at DAX and how you can use it to enhance data models.

Skills covered in this chapter:

- 2.1: Design a data model
- 2.2: Develop a data model
- 2.3: Create measures by using DAX
- 2.4: Optimize model performance

Skill 2.1: Design a data model

A proper data model is the foundation of meaningful analysis. A Power BI data model is a collection of one or more tables and, optionally, relationships. A well-designed data model enables business users to understand and explore their data and derive insights from it. Before you create any visuals, you should complete this step by loading your data and defining the relationships between tables. Data modeling often occurs at the beginning phase of building a Power BI report to be able to create efficient measures that build upon your data model. In this section, we design a data model by focusing our attention on tables and their relationships.

This skill covers how to:

- Define the tables
- Configure table and column properties
- Define quick measures
- Flatten out a parent-child hierarchy
- Define role-playing dimensions
- Define a relationship's cardinality and cross-filter direction
- Design the data model to meet performance requirements
- Resolve many-to-many relationships
- Create a common date table
- Define the appropriate level of data granularity

Define the tables

Once a query is loaded, it becomes a table in a Power BI data model. Tables can then be organized into different data model types, also known as *schemas*. Here are the three most common schemas in Power BI:

- Flat (fully denormalized) schema
- Star schema
- Snowflake schema

There are other types of data models, though these three are the most common ones.

Flat schema

In the flat type of data model, all attributes are fully denormalized into a single table. Because there's only one table, there are no relationships, and in most cases there's no need for keys.

In our Wide World Importers example, you have a single table that contains all columns from all tables, meaning that the Sale and Targets columns will be in the same table. Because the tables have different data granularity, you run into problems when comparing actuals and targets.

NOTE DATA GRANULARITY

We review the concept of data granularity later in this skill section.

From the performance point of view, flat schemas are very efficient, though there are downsides:

- A single table can be cumbersome and confusing to navigate.
- Columns and data can often be duplicated, leading to a comparatively large file size.
- Mixing facts of different grains results in more complex DAX formulas.

Flat schemas are often used when connecting to a single, simple source. However, for more complex data models, flat schemas should be avoided in Power BI as much as possible.

Star schema

When you use a star schema, tables are conceptually classified into two kinds:

- **Fact tables** These tables contain the metrics you want to aggregate. Fact tables have foreign keys, which are required to create relationships with dimensions, and columns that you can aggregate. In the Wide World Importers example, the Sale and Targets tables are fact tables. Fact tables are sometimes also known as data tables.
- **Dimension tables** These tables contain the descriptive attributes that help you slice and dice your fact tables. A dimension table has a unique identifier—a key column—and descriptive columns. In the Wide World Importers example, City, Customer, Date, Employee, and Stock Item are dimension tables. Dimension tables are also sometimes known as lookup tables.

In a star schema, fact tables are surrounded by dimensions, as shown in Figure 2-1.

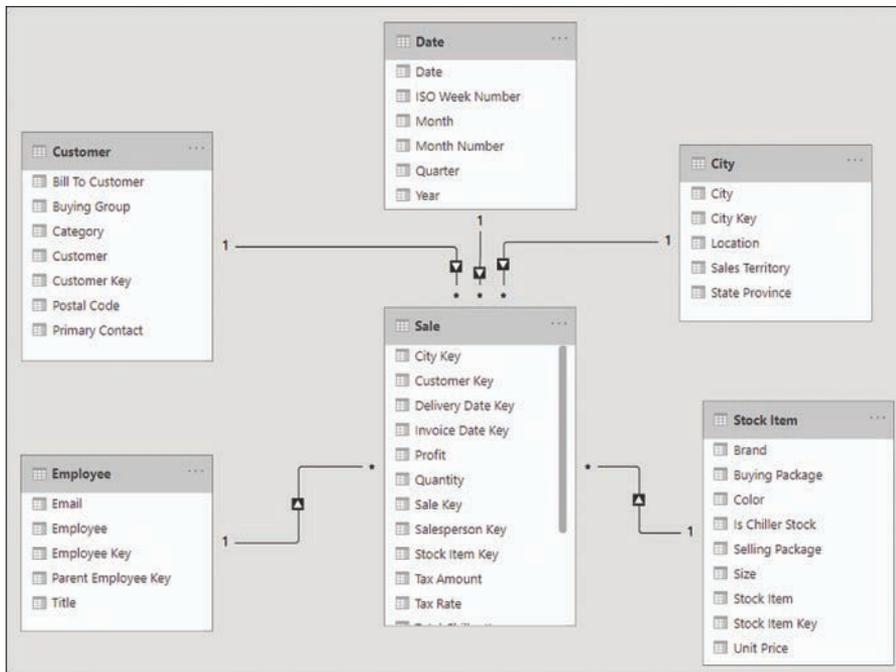


FIGURE 2-1 Star schema with Sale as the only fact table

The star schema has its name because it resembles a star, where the fact table is in the center and dimension tables are the star points. It's possible to have more than one fact table in a star schema, and it will still be a star schema.

NOTE RELATIONSHIPS

The lines that connect tables in Figure 2-1 represent relationships. We cover the relationships in more detail later in this section.

In most cases, the star schema is the preferred data modeling approach in Power BI. It addresses the shortcomings of the flat schema:

- Fields are logically grouped, making the model easier to understand.
- There is less duplication of data, which results in more efficient storage.
- You don't need to write overly complex DAX formulas to work with fact tables that have a different grain.

Snowflake schema

The snowflake schema is similar to the star schema, except it can have some dimensions that “snowflake” from other dimensions. You can see an example in Figure 2-2.

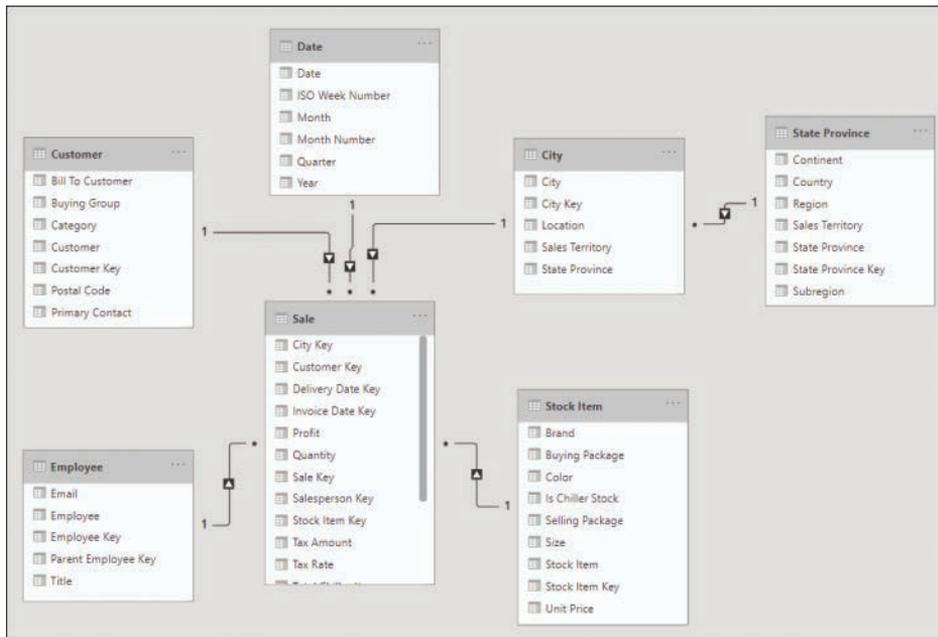


FIGURE 2-2 Snowflake schema with State Province snowflaking from the City table

In the Wide World Importers example, if you loaded the State Province query, the data model could be a snowflake schema. This is because the State Province table is related to the City dimension table, which in turn is related to the Sale fact table.

Snowflake schemas can be beneficial when there are fact tables that have different grains.

NOTE COMPANION FILE

You can see all three schemas in the 2.1.1 Define the tables.pbix file in the companion files folder.

NEED MORE REVIEW? DIMENSIONAL MODELING

In addition to fact and dimension tables, there are other types of tables such as factless facts, junk, and degenerate dimensions. For more information, see “Understand star schema and the importance for Power BI” at <https://docs.microsoft.com/en-us/power-bi/guidance/star-schema>.

Configure table and column properties

Both tables and columns have various properties you can configure, and you can do so in the **Model** view. To see the properties of a column or a table, select an object, and you see its properties in the **Properties** pane.

Table properties

For tables, depending on the storage mode, you can configure the following properties:

- **Name** Enter the table name.
- **Description** This property allows you to add a description of the table that will be stored in the model’s metadata. It can be useful when you’re building reports because you can see the description when you hover over the table in the Fields pane.
- **Synonyms** These are useful for the Q&A feature of Power BI, which we review in the next skill section. You can add synonyms so that the Q&A feature can understand that you’re referring to a specific table even if you provide a different name for it.
- **Row label** This property is useful for both Q&A and featured tables, and it allows you to select a column whose values will serve as labels for each row. For example, if you ask Q&A to show “sales amount by product,” and you select the Product Name column as the Row label of the Product table, then Q&A will show the sales amount for each product name.
- **Key column** If your table has a column that has unique values for every row, you can set the column as the key column.

- **Is hidden** You can hide a table so that it disappears from the Fields pane.
- **Is featured table** This property allows you to make a table *featured*, which will allow it to be used in Excel in certain scenarios.
- **Storage mode** This property can be set to Import, DirectQuery, or Dual, as we covered in the previous chapter.

Column properties

For columns, depending on data type, you can configure the following properties:

- **Name** Enter the column name.
- **Description** This property is the same as for tables; you can add a column description.
- **Synonyms** This property is the same as for tables; you can add synonyms to make the column work better with Q&A.
- **Display folder** You can group columns from the same table into display folders.
- **Is hidden** Hiding a column keeps it in the data model and hides it in the Fields pane.
- **Data type** The available data types are different from those available in Power Query. For instance, Percentage, Date/Time/Timezone, and Duration are not available.
- **Format** Different data types will show different formatting properties. For example, for numeric columns you'll see the following additional properties: Percentage format, Thousands separator, and Decimal places.
- **Sort by column** You can sort one column by another. For example, you can sort month names by month numbers to make them appear in the correct order.
- **Data category** This property can be useful for some visuals, and the default is Uncategorized. Depending on the data type, you can also select one of the following:
 - Address
 - City
 - Continent
 - Country/Region
 - County
 - Latitude
 - Longitude
 - Place
 - Postal Code
- **Summarize by** This property determines how the column will be aggregated if you put it into a visual. The options you can choose depend on the data type. For most data types, in addition to Don't Summarize/None, you can choose Count and Count (Distinct)/Distinct Count, while for numeric columns, you can also choose Sum, Average,

Minimum/Min, and Maximum/Max. Power BI will try to automatically determine the appropriate summarization, but it's not always accurate.

- **Is nullable** You can disallow null values for a column; if, during data refresh, a column is determined to get a null value, the refresh will fail.



EXAM TIP

You should know the difference between formatting a column and using the **FORMAT** function in DAX; **FORMAT** can be used to create a new column and always output text, whereas formatting a column retains the original data type.

NOTE MEASURE PROPERTIES

You can also configure measure properties, many of which are the same as column properties. Notable exceptions include **Sort by column**, **Summarize by**, and **Is nullable**—these properties aren't available for measures. We review measures in more detail later in this chapter.

Define quick measures

A *measure* in Power BI is a dynamic evaluation of a DAX query that will change in response to interactions with other visuals, enabling quick, meaningful exploration of your data. Creating efficient measures will be one of the most useful tools you can use to build insightful reports. If you are new to DAX and writing measures, or you are wanting to perform quick analysis, you have the option of creating a quick measure. There are several ways to create a quick measure:

- Select **Quick measure** from the **Home** ribbon.
- Right-click or select the ellipsis next to a table or column in the **Fields** pane and select **New quick measure**. This method may prefill the quick measure form shown next.
- If you already use a field in a visual, select the drop-down arrow next to the field in the **Values** section and select **New quick measure**. This method also may prefill the quick measure form shown next. If possible, this will add the new quick measure to the existing visualization. You'll be able to use this measure in other visuals too.

The following calculations are available as quick measures:

- Aggregate per category
 - Average per category
 - Variance per category
 - Max per category
 - Min per category
 - Weighted average per category

- Filters
 - Filtered value
 - Difference from filtered value
 - Percentage difference from filtered value
 - Sales from new customers
- Time intelligence
 - Year-to-date total
 - Quarter-to-date total
 - Month-to-date total
 - Year-over-year change
 - Quarter-over-quarter change
 - Month-over-month change
 - Rolling average
- Totals
 - Running total
 - Total for category (filters applied)
 - Total for category (filters not applied)
- Mathematical operations
 - Addition
 - Subtraction
 - Multiplication
 - Division
 - Percentage difference
 - Correlation coefficient
- Text
 - Star rating
 - Concatenated list of values

Each calculation has its own description and a list of field wells. You can see an example in Figure 2-3.

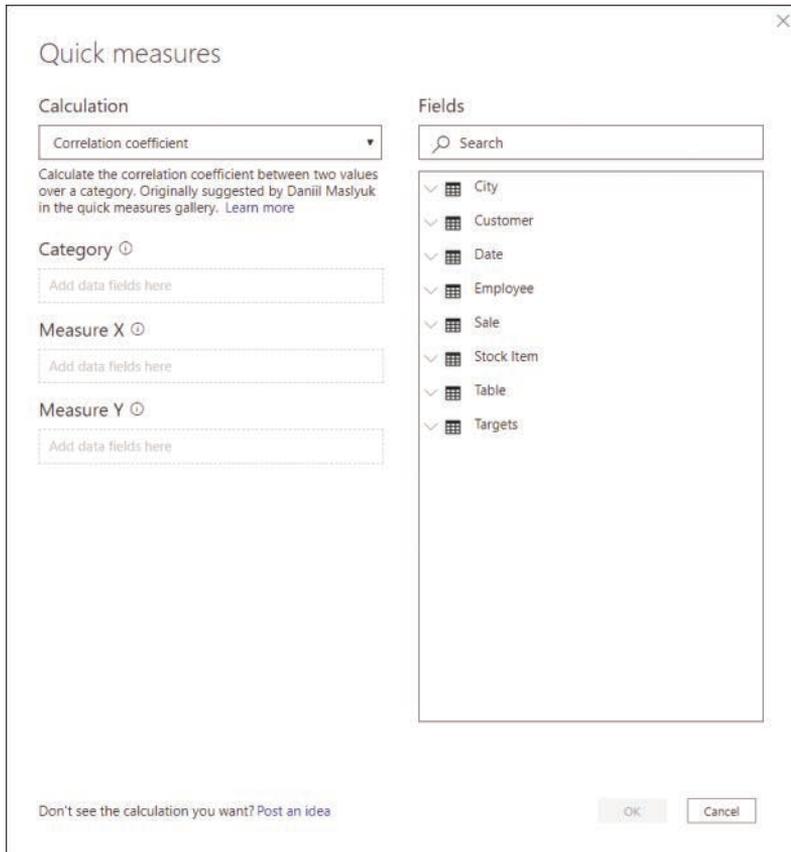


FIGURE 2-3 Quick measures dialog box

NOTE HIDDEN FIELDS

If you have any hidden fields, you won't see them in the **Fields** section of the **Quick measures** dialog box.

For example, by using quick measures, you can calculate average profit per employee for Wide World Importers:

1. Select **Quick measure** on the **Home** ribbon.
2. From the **Calculation** drop-down list, select **Average per category**.
3. Drag the **Profit** column from the **Sale** table to the **Base value** field well.
4. Drag the **Employee** column from the **Employee** table to the **Category** field well.
5. Select **OK**.

After you complete these steps, you can find the new measure called **Profit average per Employee** in the **Fields** pane.

NOTE HOME TABLE

Your new quick measure will be created in the last active table. If you're struggling to find the measure, you can use the search bar in the Fields pane.

To move a measure to a different table, select a measure in the Fields pane and select a new table from the Home table drop-down list on the Measure tools ribbon.

If you select the new measure, you'll see its DAX formula:

```
Profit average per Employee =  
AVERAGEX(  
    KEEPFILTERS(VALUES('Employee'[Employee])),  
    CALCULATE(SUM('Sale'[Profit]))  
)
```

You can modify the formula, if needed. Reading the DAX can be a great way to learn how measures can be written.

NEED MORE REVIEW? QUICK MEASURES

For more information on quick measures, including limitations and considerations, see "Use quick measures for common calculations" at <https://docs.microsoft.com/en-us/power-bi/transform-model/desktop-quick-measures>.

Flatten out a parent-child hierarchy

Parent-child hierarchies are often used for employees, charts of accounts, and organizations. Instead of being composed of several columns, parent-child hierarchies are defined by two columns: node key and parent node key. In the Wide World Importers example, you can see a parent-child hierarchy in the Employee table, shown in Figure 2-4.

Employee Key	Parent Employee Key	Employee	Title
0		Unknown	N/A
3	4	Hudson Onslow	Salesperson
4	19	Isabella Rupp	Manager
6	4	Sophia Hinton	Salesperson
7	4	Amy Trefl	Salesperson
8	12	Anthony Grosse	Salesperson
12	19	Henry Forlonge	Manager
13	12	Hudson Hollinworth	Salesperson
14	20	Lily Code	Salesperson
15	20	Taj Shand	Salesperson
16	20	Archer Lambie	Salesperson
19		Jai Shand	Director
20	19	Jack Potter	Manager

FIGURE 2-4 Employee table

For our purposes, you can ignore the “Unknown” employee. By observing the Parent Employee Key values, note the following:

- Jai Shand is a director and has no “parent employee.”
- Isabella Rupp, Henry Forlonge, and Jack Potter are all managers, and they all report to Jai Shand, their “parent employee.”
- Isabella Rupp, Henry Forlonge, and Jack Potter all act as “parent employees” to various salespersons.
- There are three levels in the hierarchy: director level, manager level, and salesperson level.

If you were to create additional columns with each column containing a hierarchy level, you would need to merge the Employee table with itself in Power Query, which would widen the table and create a more complex query. In Power BI, you can also solve this problem by using DAX and calculated columns.

To create a calculated column in a table, right-click the table in the **Fields** pane and select **New column**. In the Wide World Importers example, you can use the following formula to create a calculated column in the Employee table:

```
Employee Path = PATH(Employee[Employee Key], Employee[Parent Employee Key])
```

This adds a new column that has all hierarchy levels listed, and you can see it in Figure 2-5.

Employee Key	Parent Employee Key	Employee	Title	Employee Path
0		Unknown	N/A	0
3	4	Hudson Onslow	Salesperson	19 4 3
4	19	Isabella Rupp	Manager	19 4
6	4	Sophia Hinton	Salesperson	19 4 6
7	4	Amy Trefl	Salesperson	19 4 7
8	12	Anthony Grosse	Salesperson	19 12 8
12	19	Henry Forlonge	Manager	19 12
13	12	Hudson Hollinworth	Salesperson	19 12 13
14	20	Lily Code	Salesperson	19 20 14
15	20	Taj Shand	Salesperson	19 20 15
16	20	Archer Lamble	Salesperson	19 20 16
19		Jai Shand	Director	19
20	19	Jack Potter	Manager	19 20

FIGURE 2-5 Employee Path column

The Employee Path column is only useful for technical purposes, so it can be hidden.

The next step is to add the following three calculated columns to the Employee table:

```
Director =  
LOOKUPVALUE(  
    Employee[Employee],  
    Employee[Employee Key],  
    PATHITEM(Employee[Employee Path], 1, INTEGER)
```

```

)
Manager =
LOOKUPVALUE(
    Employee[Employee],
    Employee[Employee Key],
    PATHITEM(Employee[Employee Path], 2, INTEGER)
)
Salesperson =
LOOKUPVALUE(
    Employee[Employee],
    Employee[Employee Key],
    PATHITEM(Employee[Employee Path], 3, INTEGER)
)
)

```

All three columns use the PATHITEM function to retrieve the employee key of the specified level and LOOKUPVALUE to look up the employee name based on their key.

After you add the columns, the table should look like the one in Figure 2-6.

Employee Key	Parent Employee Key	Employee	Title	Employee Path	Director	Manager	Salesperson
0		Unknown	N/A	0	Unknown		
3	4	Hudson Onslow	Salesperson	19 4 3	Jai Shand	Isabella Rupp	Hudson Onslow
4	19	Isabella Rupp	Manager	19 4	Jai Shand	Isabella Rupp	
6	4	Sophia Hinton	Salesperson	19 4 6	Jai Shand	Isabella Rupp	Sophia Hinton
7	4	Amy Trefl	Salesperson	19 4 7	Jai Shand	Isabella Rupp	Amy Trefl
8	12	Anthony Grosse	Salesperson	19 12 8	Jai Shand	Henry Forlonge	Anthony Grosse
12	19	Henry Forlonge	Manager	19 12	Jai Shand	Henry Forlonge	
13	12	Hudson Hollinworth	Salesperson	19 12 13	Jai Shand	Henry Forlonge	Hudson Hollinworth
14	20	Lily Code	Salesperson	19 20 14	Jai Shand	Jack Potter	Lily Code
15	20	Taj Shand	Salesperson	19 20 15	Jai Shand	Jack Potter	Taj Shand
16	20	Archer Lambie	Salesperson	19 20 16	Jai Shand	Jack Potter	Archer Lambie
19		Jai Shand	Director	19	Jai Shand		
20	19	Jack Potter	Manager	19 20	Jai Shand	Jack Potter	

FIGURE 2-6 The Director, Manager, and Salesperson columns in the Employee table

Note that some Manager and Salesperson column values are blank; Jai Shand, for example, is a director with nobody above him, so both Manager and Salesperson are blank. In the Wide World Importers example, this is not a big problem because only keys of salespersons are used in the Sale table. If this is undesirable, you can use the last parameter of LOOKUPVALUE, which provides the default value, as follows:

```

Manager =
LOOKUPVALUE(
    Employee[Employee],
    Employee[Employee Key],
    PATHITEM(Employee[Employee Path], 2, INTEGER),
    Employee[Director]
)

```

```
Salesperson =  
LOOKUPVALUE(  
    Employee[Employee],  
    Employee[Employee Key],  
    PATHITEM(Employee[Employee Path], 3, INTEGER),  
    Employee[Manager]  
)
```

Using the last parameter of LOOKUPVALUE in this case ensures that all columns have values.

NOTE COMPANION FILE

You can see the final columns in the 2.1.4 Flatten PC hierarchy.pbix file in the companion files folder.

Define role-playing dimensions

In some cases, there may be more than one way to filter a fact table by a dimension. In the Wide World Importers example, the Sale table has two date columns: Invoice Date Key and Delivery Date Key, both of which can be related to the Date column from the Date table. Therefore, it is possible to analyze sales by invoice date or delivery date, depending on the business requirements. In this situation, the Date dimension is a role-playing dimension.

Although Power BI allows you to have multiple physical relationships between two tables, no more than one can be active at a time, and other relationships must be set as inactive. Active relationships, by default, propagate filters. The choice of which relationship should be set as active depends on the default way of looking at data by the business.

NEED MORE REVIEW? ACTIVE AND INACTIVE RELATIONSHIPS

For a more thorough explanation of when you would use active or inactive relationships, see “Active vs inactive relationship guidance” at <https://docs.microsoft.com/en-us/power-bi/guidance/relationships-active-inactive>.

To create a relationship between two tables, you can drag a key from one table on top of the corresponding key from the other table in the **Model** view.

NOTE AUTOMATIC DETECTION OF RELATIONSHIPS

By default, Power BI will try to detect relationships between tables automatically after you load data. In doing so, Power BI usually relies on identical column names, and the process is not always perfect. You can turn it off in **Options > Current file > Data load** if necessary.

In the Wide World Importers example, you can drag the **Date** column from the **Date** table on top of the **Invoice Date Key** column in the **Sale** table. Doing so creates an active relationship, signified by the solid line. Next, you can drag the **Date** column from the **Date** table on top of the **Delivery Date Key** column from the **Sale** table. This creates an inactive relationship, signified by the dashed line. The result should look like Figure 2-7.

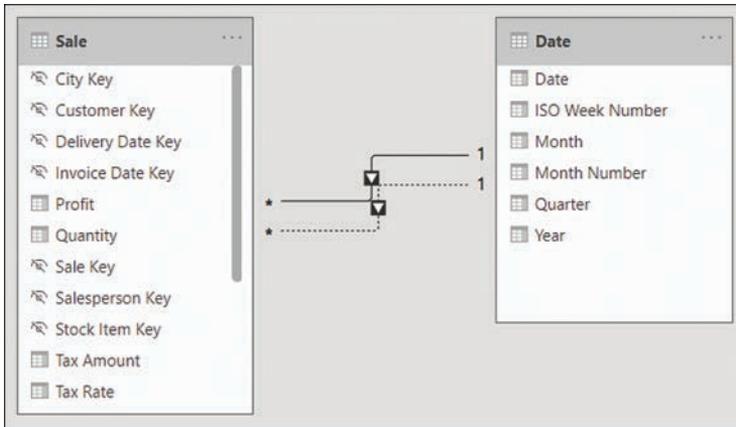


FIGURE 2-7 Relationships between Sale and Date

If you hover over a relationship line in the Model view, it highlights the fields that participate in the relationship.

NOTE CARDINALITY AND CROSS-FILTER DIRECTION

Note how each relationship line in Figure 2-7 has 1 and * at its ends, as well as an arrowhead in the middle. This represents the cardinality and cross-filter direction, respectively. We review these concepts in the next section.

In the Wide World Importers model, you should also create the relationships listed in Table 2-1.

TABLE 2-1 Additional relationships in Wide World Importers

From: Table (Column)	To: Table (Column)
Sale (City Key)	City (City Key)
Sale (Customer Key)	Customer (Customer Key)
Sale (Salesperson Key)	Employee (Employee Key)
Sale (Stock Item Key)	Stock Item (Stock Item Key)

Inactive relationships can be activated by using the USERELATIONSHIP function in DAX, which also deactivates the default active relationship, if any. The following is an example of a measure that uses USERELATIONSHIP:

```
Revenue by Delivery Date =  
CALCULATE(  
    [Revenue],  
    USERELATIONSHIP(  
        'Date' [Date],  
        Sale[Delivery Date Key]  
    )  
)
```

To use USERELATIONSHIP, you must define a relationship in the model first so that the function only works for existing relationships. This approach is useful for scenarios such as the Wide World Importers example, where you have multiple date columns within the same fact table.

NEED MORE REVIEW? CALCULATE AND USERELATIONSHIP

CALCULATE is the most important function in DAX, and we review it in more detail later in this chapter. It's important to be aware of certain limitations of **USERELATIONSHIP**. For more information, see "USERELATIONSHIP" at <https://docs.microsoft.com/en-us/dax/userelationship-function-dax>.

If you have several measures that you want to analyze by using different relationships, this may result in your data model having many similar measures, cluttering your data model to a degree.

Another drawback of using USERELATIONSHIP is that you cannot analyze data by using two relationships at the same time. For instance, if you have a single Date table, it won't be possible to see which sales were invoiced last year and shipped this year.

An alternative to USERELATIONSHIP that addresses these drawbacks is to use separate dimensions for each role or relationship. In case of Wide World Importers, you would have Delivery Date and Invoice Date dimensions, which would make it possible to analyze sales by both delivery and invoice dates.

You have a few ways to create the new dimensions based on the existing Date table, one of which is to use calculated tables. For the Invoice Date table, the DAX formula would be as follows:

```
Invoice Date = 'Date'
```

The benefit of using calculated tables instead of referencing or duplicating queries in Power Query is that if you have calculated columns in your Date table, they will be copied in a calculated table, whereas you would have to re-create the same columns if you used Power Query to create the copies of the dimension.

When you're creating separate dimensions, it's best to rename the columns to make it clear where fields are coming from. For example, instead of leaving the column called Date, rename

it to Invoice Date. You can do so by right-clicking a field in the **Fields** pane and selecting **Rename** or by double-clicking a field. Alternatively, you can rename fields by using a more complex calculated table expression. For example, you could use the SELECTCOLUMNS function in DAX to rename columns.

NOTE COMPANION FILE

You can see the calculated tables in the 2.1.5 Define role-playing dimensions.pbix file in the companion files folder.

NOTE CALCULATED TABLES

DAX allows you to create far more sophisticated calculated tables than copies of existing tables. We review calculated tables in more detail in Skill 2.2: Develop a data model.

Define a relationship’s cardinality and cross-filter direction

In the previous section, you saw how to create relationships between tables. In this section, we review the concepts of cardinality and cross-filter direction of relationships.

You can edit a relationship by double-clicking it in the Model view. For example, in Figure 2-8 you can see the options for one of the relationships between the Sale and the Date tables.

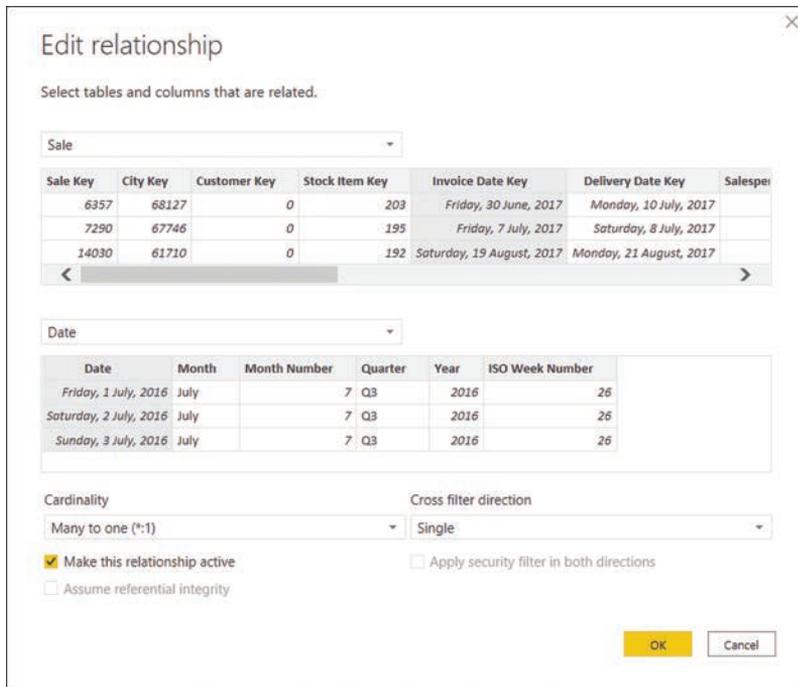


FIGURE 2-8 Relationship options

In the relationship options, you can select tables from drop-down lists. For each table, you get a preview of it, from which you can select a column that will be part of a relationship. Unlike for the Merge operation in Power Query, only one column from each table can be part of a relationship.

The **Make this relationship active** check box determines whether the relationship is active. Between two tables, there can be no more than one active relationship.

When using DirectQuery, the **Assume referential integrity** option is available, and it can improve query performance in certain cases.

NEED MORE REVIEW? ASSUME REFERENTIAL INTEGRITY

There are some requirements that data must meet for the Assume referential integrity option to work properly. For advanced details on this feature, including the requirements and implications of not meeting the requirements with this option set, see “Apply the Assume Referential Integrity setting in Power BI Desktop” at <https://docs.microsoft.com/en-us/power-bi/connect-data/desktop-assume-referential-integrity>.

Two options are worth reviewing in more detail: **Cardinality** and **Cross-filter direction**.

Cardinality

Depending on the selected tables and columns, you can select one of the following options:

- Many-to-one
- One-to-one
- One-to-many
- Many-to-many

Many-to-one and *one-to-many* are the same kind of relationship, and they only differ in the order in which the tables are listed. “Many” means that a key may appear more than once in the selected column, whereas “one” means a key value appears only once in the selected column. In our Wide World Importers example earlier, the Sale table was on the *many* side, whereas the Date table was on the *one* side; a single date appeared only once in the Date table, though there could be multiple sales on the same date in the Sale table.

One-to-one is a special kind of relationship in which a key value appears only once on both sides of the relationship. This type of relationship can be useful for splitting a single dimension with many columns into separate tables. You should use one-to-one only if you are confident that no duplicates will appear in this table, since duplicates would cause immediate errors in your data model.

NEED MORE REVIEW? ONE-TO-ONE RELATIONSHIPS

One-to-one relationships are rarely encountered in real life. For advanced information on this type of relationships in Power BI, see “One-to-one relationship guidance” at <https://docs.microsoft.com/en-us/power-bi/guidance/relationships-one-to-one>.

Many-to-many relationships in this context refer to direct relationship between two tables, neither of which is guaranteed to have unique keys. We review this type of relationship later in this chapter.

Cross-filter direction

This option determines the direction in which filters flow. For many-to-one and one-to-many relationships, you can select Single or Both.

- If you select **Single**, then the filters from the table on the “one” side will filter through to the table on the “many” side. This setting is signified by a single arrowhead on the relationship line in the Model view.
- If you select **Both**, then filters from both tables will flow in both directions, and such relationships are also known as *bidirectional*. This setting is signified by two arrowheads on the relationship line in the Model view, facing in opposite directions. When this option is selected, you can also select **Apply security filter in both directions** to make row-level security filters flow in both directions, too.

To illustrate the concept, consider the data model shown in Figure 2-9.

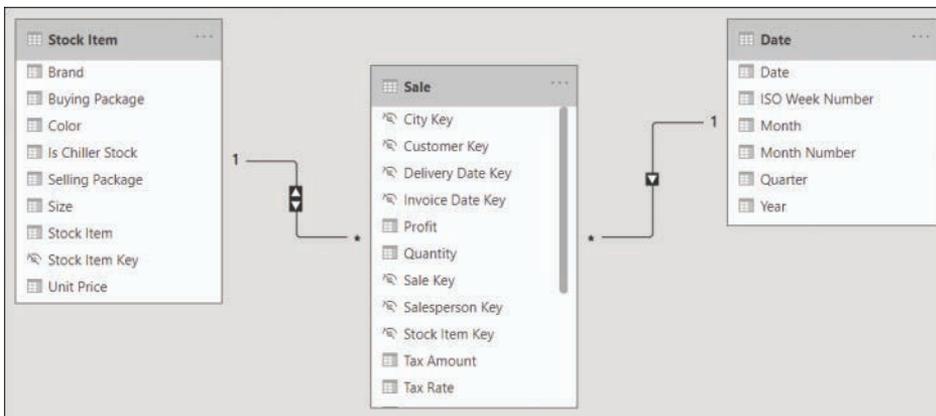


FIGURE 2-9 Sample data model

From this data model, you can create two table visuals as follows:

- Table 1: Distinct count of Stock Item by Year
- Table 2: Distinct count of Year by Stock Item

Both table visuals are shown in Figure 2-10. The first four rows are shown for Table 2 for illustrative purposes.

You can see that in Table 1, the numbers are different for different years and the total, whereas in Table 2, the Distinct Count of Year is showing 6 for all rows, including the total.

Table 1		Table 2	
Year	Distinct Count of Stock Item	Stock Item	Distinct Count of Year
2017	219	"The Gu" red shirt XML tag t-shirt (Black) 3XL	6
2018	219	"The Gu" red shirt XML tag t-shirt (Black) 3XS	6
2019	219	"The Gu" red shirt XML tag t-shirt (Black) 4XL	6
2020	227	"The Gu" red shirt XML tag t-shirt (Black) 5XL	6
Total	228	Total	6

FIGURE 2-10 Table visuals

The numbers are different in Table 1 because filters from the Date table can reach the Stock Item table through the Sale table; the Date table filters the Sale table because there is a one-to-many relationship; then the Sale table filters the Stock Item table because there is a bidirectional relationship. In 2017, 2018, and 2019, Wide World Importers coincidentally sold 219 stock items, whereas in 2020, they sold 227 stock items. At the total level you see 228, which is not the total sum of stock items sold across all years.

In Table 2, the numbers are the same because filters from the Stock Item table don't reach the Date table since there is no bidirectional filter. Even though you only had sales in four years, you see 6 across all rows, which is the number of years in the Date table.

It's also possible to set the cross-filter direction by using the CROSSFILTER function in DAX, as you can see in the following example:

```
Stock Items Sold =
CALCULATE(
    DISTINCTCOUNT('Stock Item'[Stock Item]),
    CROSSFILTER(
        Sale[Stock Item Key],
        'Stock Item'[Stock Item Key],
        BOTH
    )
)
```

The syntax of CROSSFILTER is similar to USERELATIONSHIP—the first two parameters are related columns. Additionally, there's the third parameter—direction—and it can be one of the following:

- **BOTH** This option corresponds to **Both** in the relationship cross-filter direction options.
- **NONE** This option deactivates the relationship, and it corresponds to the cleared **Make this relationship active** check box.
- **ONEWAY** This option corresponds to **Single** in the relationship cross-filter direction options.

Bidirectional filters are sometimes used in many-to-many relationships with bridge tables when direct many-to-many relationships are not desirable.

NOTE COMPANION FILE

You can see the relationships in the 2.1.6 Define a relationship's cardinality and cross-filter direction.pbix file in the companion files folder.

NEED MORE REVIEW? BIDIRECTIONAL RELATIONSHIPS

For more examples and information on bidirectional relationships, see "Bi-directional relationship guidance" at <https://docs.microsoft.com/en-us/power-bi/guidance/relationships-bidirectional-filtering>.

NEED MORE REVIEW? RELATIONSHIPS TROUBLESHOOTING

Relationships may not work as expected for numerous reasons. For a comprehensive troubleshooting guide, see "Relationship troubleshooting guidance" at <https://docs.microsoft.com/en-us/power-bi/guidance/relationships-troubleshoot>.

Design the data model to meet performance requirements

The way you design a Power BI data model ultimately affects the performance of reports. A well-designed data model takes into consideration both business requirements and the constraints of data sources. Performance tuning is a broad topic; we cover some key concepts you should keep in mind while designing your data model:

- Storage mode
- Relationships
- Aggregations
- Cardinality

Storage mode

As you saw in the first chapter, Power BI supports several connectivity modes:

- Imported data
- DirectQuery
- Live Connection

Refer to the first chapter for more details.

Relationships

When you're using composite models, it's important to remember that relationships perform differently depending on the storage mode of the related tables.

You can use the concept of *islands* as an analogy of where data is queried to understand how data models work in practice. If you use two DirectQuery data sources, then each of them

is a separate island. In contrast, all imported data resides in the same island regardless of where it originally came from, because all imported data is queried from memory. When you connect to data on the same island, you will have the fastest results since you don't need to "swim" to another island.

You can see different kinds of relationships ordered from fastest to slowest in the following list:

- One-to-many intra-island relationships
- Direct many-to-many relationships
- Many-to-many relationships with bridge tables
- Cross-island relationships

We review many-to-many relationships in detail in the next section.

Aggregations

When using DirectQuery, you can import some summarized data so that the most frequently queried data resides in memory and is retrieved quickly, whereas detailed data is queried from the data source. This feature is called *aggregations*, and we review it later in this chapter.

Cardinality

The term *cardinality*, in addition to defining relationships, also refers to the number of distinct values in a column. Power BI stores imported data in columns, not rows. For this reason, the cardinality of each column affects performance. In general, the fewer distinct values there are, the better performance. We review ways to reduce cardinality later in this chapter.

NEED MORE REVIEW? MODEL DESIGN OPTIMIZATION

For further guidance on optimizing the model design, see "Optimize model design" at <https://docs.microsoft.com/en-us/power-bi/guidance/composite-model-guidance#optimize-model-design>.

Resolve many-to-many relationships

Many-to-many relationships occur very frequently in models. In general, many-to-many relationships happen in two cases:

- **Many-to-many relationships between dimensions** For example, one client may have multiple accounts, and an account may belong to different clients.
- **Relationships between tables at different granularities** For example, you may have a sales table at the date level and a targets table at the month level. Both tables could be related to a single date table. In this case, the relationship between the targets and date tables would be many-to-many since they are of different grain.

NOTE DATA GRANULARITY

We review the concept of data granularity later in this chapter.

In the Wide World Importers example, a many-to-many relationship exists between the Date and Stock Item tables; on each date, multiple stock items could be sold, and each stock item could be sold on multiple dates. In this case, the relationship goes through the Sale table. Additionally, a many-to-many relationship exists between the Date dimension and the Targets fact table because the grain of the tables is different.

Power BI supports many-to-many relationships of two kinds:

- Direct many-to-many relationships
- Many-to-many relationships through a bridge table

NOTE COMPANION FILES

If you want to follow along with the examples, open the 2.1.8 Resolve many-to-many relationships.pbix file from the companion files folder.

Direct many-to-many relationships

As you saw earlier in this chapter, Power BI supports the many-to-many cardinality for relationships, allowing you to create a many-to-many relationship between two tables directly.

You will now create a relationship between the Targets table and the Customer table based on Buying Group, the same way you create other relationship types:

1. Go to the **Model** view.
2. Drag the **Buying Group** column from the **Customer** table on top of the **Buying Group** column from the **Targets** table.
3. Ensure the **Make this relationship active** check box is selected.
4. Set **Cross filter direction** to **Single (Customer filters Targets)**. Figure 2-11 shows how your options should look.
5. Select **OK**.

You can see asterisks on both sides of the relationship that indicate the many-to-many relationship.

This method performs well when the number of unique values on each side of a relationship is fewer than 1,000; otherwise, the method may be slow and creating a bridge table would be a more efficient solution. The technical details on why this happens are out of the scope of the exam.

Another limitation that this kind of relationships has is that you cannot use the RELATED function in DAX since neither table is on the “one” side.

Create relationship

Select tables and columns that are related.

Customer

Customer Key	Customer	Bill To Customer	Category	Buying Group	Primary Cont
1	Tailspin Toys (Head Office)	Tailspin Toys (Head Office)	Novelty Shop	Tailspin Toys	Waldemar Fis
2	Tailspin Toys (Sylvanite, MT)	Tailspin Toys (Head Office)	Novelty Shop	Tailspin Toys	Lorena Cindric
3	Tailspin Toys (Peeples Valley, AZ)	Tailspin Toys (Head Office)	Novelty Shop	Tailspin Toys	Bhaargav Rarr

Targets

End of Month	Buying Group	Target Excluding Tax
Tuesday, 31 January, 2017	Tailspin Toys	750000
Tuesday, 28 February, 2017	Tailspin Toys	750000
Friday, 31 March, 2017	Tailspin Toys	750000

Cardinality: Many to Many (**:*)

Cross filter direction: Single (Customer filters Targets)

Make this relationship active

Assume referential integrity

Apply security filter in both directions

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

OK Cancel

FIGURE 2-11 Relationship options

This creates a relationship, as shown in Figure 2-12.

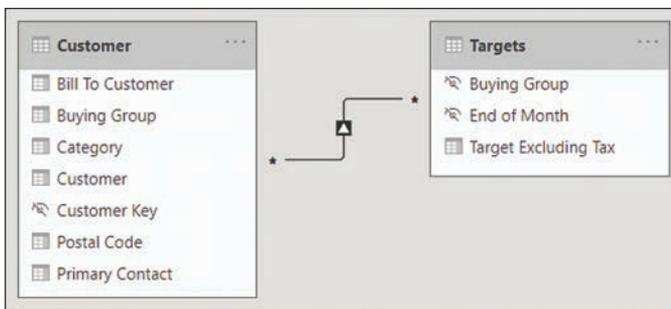


FIGURE 2-12 Relationship between Customer and Targets

Many-to-many relationships with bridge tables

A different way of creating a many-to-many relationship in Power BI is to use a bridge table. A *bridge table* is a table that allows you to create one-to-many relationships with each table that is in a many-to-many relationship. Bridge tables can be of two kinds:

- **A one-column table with unique values** The bridge table is on the one side in each relationship. This is typical for relating facts or tables that have different grains.
- **A two-column table with unique combination of values** The bridge table is on the many side in each relationship. This is common for many-to-many relationships between dimensions.

In the Wide World Importers example, the Date and Targets tables have different grains:

- Targets has one row per Buying Group and the end-of -month date.
- Date has one row per date.

Note that the Date table does not have a column that contains end-of-month dates. Dates are a special case, because you can create a one-to-many relationship between Date and Targets and avoid having a many-to-many relationship.

NOTE DATE GRAIN MISMATCH

When you relate monthly Targets with the Date table, you need to pay attention to what values you'll be showing when you filter the Date table by dates. We address this issue later in this chapter in the section titled "Define the appropriate level of data granularity."

To illustrate this in practice, let's create a many-to-many relationship between Date and Targets based on End of Month date. First, add the End of Month column to the Date table:

1. Launch **Power Query Editor** by selecting **Transform Data** on the **Home** ribbon.
2. Select the **Date** column in the **Date** query.
3. On the **Add column** ribbon, select **From date & time** > **Date** > **Month** > **End of month**.

There are several ways to create a bridge table through Power Query, calculated tables in DAX, or importing a new table that all achieve the same outcome. For our requirement, let's create a bridge table between the Date and Targets table by using Power Query:

1. In Power Query Editor, right-click the **Date** query and select **Reference**.
2. Rename the newly created **Date (2)** query to **End of Month**.
3. Right-click the **End of Month** column header and select **Remove other columns**.
4. Right-click the **End of Month** column and select **Remove duplicates**.
5. On the **Home** ribbon, select **Close & apply**.

You can now relate the Date and Targets tables as shown in Table 2-2.

TABLE 2-2 Date, End of Month, and Targets relationships

From: Table (Column)	To: Table (Column)	Active	Cross Filter Direction
Date (End of Month)	End of Month (End of Month)	Yes	Both
Targets (End of Month)	End of Month (End of Month)	Yes	Single

You can see the relationships in Figure 2-13.

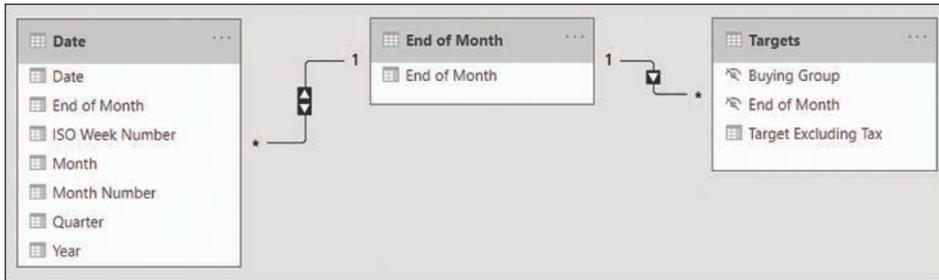


FIGURE 2-13 Date, End of Month, and Targets relationships

NOTE COMPANION FILE

You can see the final result in the 2.1.8 Resolve many-to-many relationships.pbix file in the companion files folder.

NEED MORE REVIEW? MANY-TO-MANY RELATIONSHIPS

For more examples of many-to-many relationships, see “Many-to-many relationship guidance” at <https://docs.microsoft.com/en-us/power-bi/guidance/relationships-many-to-many> and “Apply many-many relationships in Power BI Desktop” at <https://docs.microsoft.com/en-us/power-bi/transform-model/desktop-many-to-many-relationships>.

Create a common date table

By default, Power BI creates a calendar hierarchy for each date or date/time column from your data sources.

NEED MORE REVIEW? AUTO DATE/TIME HIERARCHIES

For detailed considerations and limitations of the auto date/time feature, see “Auto date/time guidance in Power BI Desktop” at <https://docs.microsoft.com/en-us/power-bi/guidance/auto-date-time>.

Although these can be useful in some cases, it's best practice to create your own date table, which has several benefits:

- You can use a calendar other than Gregorian.
- You can have weeks in the calendar.
- You can filter multiple fact tables by using a single date dimension table.

If you don't have a date table you can import from a data source, you can create one yourself. It's possible to create a date table by using Power Query or DAX, and there's no difference in performance between the two methods.

Creating a calendar table in Power Query

In Power Query, you can use the M language `List.Dates` function, which returns a list of dates, and then convert the list to a table and add columns to it. The following query provides a sample calendar table that begins on January 1, 2016:

```
let
    Source = #date(2016, 1, 1),
    Dates = List.Dates(Source, Duration.TotalDays(Date.AddYears(Source, 6) - Source),
        #duration(1,0,0,0)),
    #"Converted to Table" = Table.FromList(Dates, Splitter.SplitByNothing(),
        type table [Date = date]),
    #"Inserted Year" = Table.AddColumn(#"Converted to Table", "Year",
        each Date.Year([Date]), Int64.Type),
    #"Inserted Month Name" = Table.AddColumn(#"Inserted Year", "Month Name",
        each Date.MonthName([Date]), type text),
    #"Inserted Month" = Table.AddColumn(#"Inserted Month Name", "Month",
        each Date.Month([Date]), Int64.Type),
    #"Inserted Week of Year" = Table.AddColumn(#"Inserted Month", "Week of Year",
        each Date.WeekOfYear([Date]), Int64.Type)
in
    #"Inserted Week of Year"
```

If you want to add the calendar table to your model, start with a blank query:

1. In Power Query Editor, select **New Source** on the **Home** ribbon.
2. Select **Blank Query**.
3. With the new query selected, select **Query > Advanced Editor** on the **Home** ribbon.
4. Replace all existing code with the code above and select **Done**.
5. Give your query an appropriate name such as *Calendar* or *Date*.

The result should look like Figure 2-14, where the first few rows of the query are shown.

	Date	Year	Month Name	Month	Week of Year
1	01-Jan-16	2016	January		1
2	02-Jan-16	2016	January		1
3	03-Jan-16	2016	January		2
4	04-Jan-16	2016	January		2
5	05-Jan-16	2016	January		2
6	06-Jan-16	2016	January		2
7	07-Jan-16	2016	January		2
8	08-Jan-16	2016	January		2
9	09-Jan-16	2016	January		2
10	10-Jan-16	2016	January		3

FIGURE 2-14 Sample calendar table built by using Power Query

You may prefer having a table in Power Query when you intend to use it in some other queries, since it's not possible to reference calculated tables in Power Query.

Creating a calendar table in DAX

If you choose to create a date table in DAX, you can use the `CALENDAR` or `CALENDARAUTO` function, both of which return a table with a single `Date` column. You can then add calculated columns to the table, or you can create a calculated table that has all the columns right away.

NOTE CALCULATED TABLES

We review the skills necessary to create calculated tables in Skill 2.2: Develop a data model.

The `CALENDAR` function requires you to provide the start and end dates, which you can hardcode for your business requirements or calculate dynamically:

```
Calendar Dynamic =
CALENDAR(
    MIN(Sale[Invoice Date Key]),
    MAX(Sale[Invoice Date Key])
)
```

The `CALENDARAUTO` function scans your data model for dates and returns an appropriate date range automatically.

To build a table similar to the Power Query table we built before, we can use the following calculated table formula in DAX:

```
Calendar =
ADDCOLUMNS(
    CALENDARAUTO(),
    "Year", YEAR([Date]),
    "Month Name", FORMAT([Date], "MMMM"),
    "Month", MONTH([Date]),
    "Week of Year", WEEKNUM([Date])
)
```

NOTE COMPANION FILE

You can see different date tables in the 2.1.9 Create a common date table.pbix file in the companion files folder.

NEED MORE REVIEW? CREATING DATE TABLES

For more examples of how you can create a date table, see “Create date tables in Power BI Desktop” at <https://docs.microsoft.com/en-us/power-bi/guidance/model-date-tables>.

Define the appropriate level of data granularity

Data granularity refers to the *grain* of data, or the level of detail that a table can provide. For example, the Targets table in the Wide World Importers example provides a target figure for each month for each buying group, so the granularity is the month-buying group. If you filter the Targets table by a field that is at lower granularity—such as Customer or Date—you won’t get any meaningful results. Figure 2-15 shows targets by date.

End of Month	Target Excluding Tax
☐ January 2017	2,250,000.00
01-Jan-17	2,250,000.00
02-Jan-17	2,250,000.00
03-Jan-17	2,250,000.00
04-Jan-17	2,250,000.00
05-Jan-17	2,250,000.00
06-Jan-17	2,250,000.00
07-Jan-17	2,250,000.00

FIGURE 2-15 Targets by date

You can see that the same number is repeated at month level and date level, which can be confusing. To deal with this, you need to account for cases when targets are shown at unsupported levels of granularity.

There are a few ways of solving the problem. For example, you can make a measure return a result only when the unsupported grains are not filtered:

```
Total Target (filters) =  
IF(  
    NOT(  
        ISFILTERED('Date'[Date])  
        || ISFILTERED('Date'[ISO Week Number])  
        || ISFILTERED(Customer[Customer Key])  
        || ISFILTERED(Customer[Customer])  
        || ISFILTERED(Customer[Primary Contact])  
        || ISFILTERED(Customer[Postal Code])  
    )  
)
```

```

    || ISFILTERED('Stock Item')
    || ISFILTERED(Employee)
    || ISFILTERED(City)
),
SUM(Targets[Target Excluding Tax])
)

```

You can see the result in Figure 2-16.

End of Month	Target Excluding Tax	Total Target (filters)
☐ January 2017	2,250,000.00	2,250,000.00
01-Jan-17	2,250,000.00	
02-Jan-17	2,250,000.00	
03-Jan-17	2,250,000.00	
04-Jan-17	2,250,000.00	
05-Jan-17	2,250,000.00	
06-Jan-17	2,250,000.00	
07-Jan-17	2,250,000.00	

FIGURE 2-16 Total Target measure used in a table

Although this approach can work in many cases, it has a downside. If new columns are introduced and they aren't at the supported level of granularity, then you'd need to modify your code. An alternative is to check the number of rows in the supported dimensions as follows:

```

Total Target (rows) =
VAR DateRows = COUNTROWS('Date')
VAR DateRowsAtMonthLevel =
    CALCULATE(
        COUNTROWS('Date'),
        REMOVEFILTERS('Date'),
        VALUES('Date'[End of Month])
    )
VAR CustomerRows = COUNTROWS(Customer)
VAR CustomerRowsAtBuyingGroupLevel =
    CALCULATE(
        COUNTROWS(Customer),
        REMOVEFILTERS(Customer),
        VALUES(Customer[Buying Group])
    )
VAR UnsupportedFilters =
    (DateRows <> DateRowsAtMonthLevel)
    || (CustomerRows <> CustomerRowsAtBuyingGroupLevel)
    || ISFILTERED('Stock Item')
    || ISFILTERED(Employee)
    || ISFILTERED(City)

```

```

VAR Result =
    IF(
        NOT(UnsupportedFilters),
        SUM(Targets[Target Excluding Tax])
    )
RETURN
    Result

```

You may still want to check whether unsupported tables are filtered, so you're still using `ISFILTERED` for some tables. The result, shown in Figure 2-17, is the same as for the previous measure.

End of Month	Target Excluding Tax	Total Target (filters)	Total Target (rows)
☐ January 2017	2,250,000.00	2,250,000.00	2,250,000.00
01-Jan-17	2,250,000.00		
02-Jan-17	2,250,000.00		
03-Jan-17	2,250,000.00		
04-Jan-17	2,250,000.00		
05-Jan-17	2,250,000.00		
06-Jan-17	2,250,000.00		
07-Jan-17	2,250,000.00		

FIGURE 2-17 An alternative measure

NOTE COMPANION FILE

You can see the measures in the 2.1.10 Define the appropriate level of data granularity.pbix file in the companion files folder.

NOTE MEASURES

We review DAX measures in more detail in Skill 2.3: Create measures by using DAX.

Skill 2.2: Develop a data model

Data model development refers to enhancements you add to your model after you've loaded your data and created relationships between tables. In this section, we review the skills you need to create calculated tables, calculated columns, and hierarchies, and we show you how to configure row-level security for your report as well as set up the Q&A feature.

Index

A

- accessibility, reports, 165–166
 - alt text, 166
 - markers, 166
 - page names, titles, and labels, 166
 - tab order, 167
 - theme and color selection, 167–168
- adding, columns, 46–48
- advanced analysis
 - applying AI Insights, 223
 - binning, 219
 - breaking down a measure using the Decomposition tree, 222
 - explore dimensional variances with Key influencers visual, 219–221
 - grouping, 217
 - identifying outliers, 215–217
- aggregations, 87, 131–133
- AI (artificial intelligence), 201
 - Insights, 223
- appending queries, 50–52
- apps, 251, 254
 - navigation, 252–253
 - permissions, 253–254
 - setup, 252
 - unpublishing, 255
 - updating, 255
- AppSource, importing visuals, 155
- area charts, 145
- artificial intelligence visuals, 154
- automatic page refresh
 - change detection, 169–170
 - fixed interval, 168–169

B

- bar charts, 144
- binning, 219
- bookmarks, 180–183

C

- CALCULATE function, 116, 124
 - adding filters, 117
 - context transition, 119–122
 - removing filters, 117–118
 - updating filters, 118–119
- calculated columns, 100–102
- calculated tables, 97
- CALENDAR function, 93
- calendar tables, creating, 92–93
- CALENDARAUTO function, 93
- card visual, 153–154
- cardinality, 83–84, 87
 - data summarization, 131
 - improving by changing data types, 130–131
 - resolving many-to-many relationships, 87–88
 - bridge tables, 90–91
 - direct, 88
- charts
 - area, 145
 - bar, 144
 - combo, 145–146
 - donut, 149–150
 - funnel, 148
 - gauge, 152–153
 - identifying outliers, 215–217
 - line, 145
 - pie, 149–150
 - Play axis, conducting time-series analysis, 212–214
 - reference lines, 211–212
 - ribbon, 146–147
 - scatter, 149
 - treemap, 150–151
 - waterfall, 147–148
- cloning, tables, 98
- column profiling, 28

columns

- columns
 - adding, 46–48
 - calculated, 100–102
 - combining, 39–40
 - hierarchies, 99–100
 - parent-child hierarchies, 76–79
 - pivoting/unpivoting, 44–45
 - properties, 72–73
 - reducing, 42–44
 - removing, 129
 - replacing values, 33
 - replacing with measures, 124–125
 - transforming data types, 35–37
- combining
 - columns, 39–40
 - queries, 50
- combo charts, 145–146
- companion files, 2, 5, 22, 28, 59, 71
- composite models, 11
 - Dual mode, 12
 - security risks, 11
 - table properties, 11–12
- conditional formatting, 156–158, 206
 - removing, 202
 - tables and matrixes, 202
 - background color and font color, 202–204
 - data bars, 204–205
 - icons, 205–206
- connectors, 2–5
- creating
 - calculated tables, 97
 - calendar tables
 - in DAX, 93–94
 - in Power Query, 92–93
 - dataflows, 25–26
 - functions, 23–24
 - hierarchies, 99–100
 - queries, parameters, 19–20
 - roles, 103–105
 - semi-additive measures, 125–128
 - tables, 98–99
 - workspaces, 246–248
- cross-filter direction, 84–85
- CROSSFILTER function, 85
- custom tooltips, 183–185
- custom visuals, 142

D

- dashboards, 172. *See also* reports
 - data alerts, 176–177
 - mobile view, 174–176
 - pinning a live report page, 179
 - Quick Insights, 210–211
 - themes, 178–179
 - tiles, 172–174
- data alerts, 176–177
- data bars, conditional formatting, 204–205
- data granularity, 94–96
- data modeling, 67, 91–92
 - aggregations, 131–133
 - changing data types, 130–131
 - data granularity, 94–96
 - data summarization, 131
 - designing a data model, 67
 - designing to meet performance requirements, 86
 - aggregations, 87
 - relationships, 86–87
 - storage mode, 86
- development, 96
 - apply cross-filter direction and security filtering, 97
 - cloning tables, 98
 - creating calculated columns, 100–102
 - creating calculated tables, 97
 - creating tables based on data from different sources, 98–99
 - hierarchies, 99–100
 - implement row-level security roles, 102–103
 - precalculating measures to improve report performance, 99
- identify poorly performing measures, relationships, and visuals, 129–130
- parent-child hierarchies, 76–79
- quick measures, 73–76
- relationships, 82–83
 - cardinality, 83–84, 87
 - cross-filter direction, 84–85
 - many-to-many, 88, 90–91
- removing unnecessary columns, 129
- removing unnecessary rows, 128–129
- role-playing dimensions, 79–82
- tables, 68
 - column properties, 72–73
 - flat schema, 68–69

- properties, 71–72
 - snowflake schema, 70–71
 - star schema, 69–70
- data profiling, 27
 - examine data structures and interrogate column properties, 28–30
 - identify data anomalies, 27–28
 - interrogate data statistics, 30–31
- data sources, connecting to, 2–5, 26–27
- data summarization, 131
- data types, transforming, 35–37
- data visualization, 141. *See also* visuals
 - area charts, 145
 - artificial intelligence visuals, 154
 - bar charts, 144
 - card visual, 153–154
 - choosing visualization type, 143
 - combo charts, 145–146
 - conducting time-series analysis, 212–214
 - configuring scheduled refresh, 231–232
 - cross-filter, 191–193
 - dashboards, 172
 - data alerts, 176–177
 - mobile view, 174–176
 - pinning a live report page, 179
 - Quick Insights, 210–211
 - themes, 178–179
 - tiles, 172–174
 - Decomposition tree, 222
 - donut charts, 149–150
 - drill-through, 191–193
 - editing interactions between visuals, 185–186
 - expression-based formatting, 156–158
 - filters
 - Filters pane, 159–161
 - slicers, 158–159
 - formatting, 154
 - funnel charts, 148
 - gauge charts, 152–153
 - importing visuals, 155
 - from AppSource, 155
 - from a file, 156
 - interactive visuals, 193–194
 - Key influencers visual, 219–221
 - KPI visual, 153–154
 - line charts, 145
 - maps, 151–152
 - multi-row card visual, 153–154
 - personalizing visuals, 214–215
 - pie charts, 149–150
 - Python visuals, 161–164
 - R visuals, 161–164
 - reference lines, 211–212
 - reports
 - accessibility, 165–166
 - adding visuals, 142–143
 - bookmarks, 180–183
 - custom tooltips, 183–185
 - designing for mobile devices, 195
 - enriching for usability, 180
 - formatting, 164–165
 - navigation, 186–187
 - paginated, 170–172
 - ribbon charts, 146–147
 - scatter charts, 149
 - sorting visuals, 187–188
 - sync slicers, 188–190
 - treemap charts, 150–151
 - waterfall charts, 147–148
- dataflows, creating, 25–26
- datasets
 - accessing on-premises data, 230–231
 - assigning roles in the Power BI service, 232–234
 - enabling large dataset format, 244–246
 - endorsing, 242–244
 - granting access, 229, 235
 - impact analysis, 237
 - incremental refresh settings, 238
 - creating the RangeStart and RangeEnd parameters, 238–239
 - filtering by using the RangeStart and RangeEnd parameters, 239–240
 - policies, 241–242
 - managing, 229
 - permissions, 236–237
 - published, 8
 - query folding, 242
 - RLS (row-level security) group membership, 232
 - selecting, 7–8
 - sharing
 - through a workspace, 235
 - through an app, 235–236
 - viewing as roles in the Power BI service, 234–235
- date tables, 91–92
 - calendar tables, creating, 92–93
- DAX (data analysis expressions), 67
 - building complex measures, 113–116
 - calendar tables, creating, 93–94

DAX (data analysis expressions)

- creating quick measures, 113
- Time Intelligence, 122–124
- top N analysis, 207–208
- variables, 116
- Decomposition tree, 222
- defining, quick measures, 73–76
- development lifecycle strategy, 248
 - deployment pipeline, 249–250
 - parameters, 248–249
- direct many-to-many relationships, 88
- DirectQuery, 10, 12
 - aggregations, 87
 - composite models, 11–12
 - implications of using
 - data modeling limitations, 13–14
 - not every query type is usable, 13
 - report performance varies, 13
 - Live Connection, 9, 11
- DISTINCT function, 98
- DIVIDE function, 115
- donut charts, 149–150
- dynamic row-level security, 106–108

E

- editing
 - interactions between visuals, 185–186
 - query parameters, 22–23
 - query steps, 42
- endorsing datasets, 242–244
- entities, 19
- errors
 - data import, 59–61
 - identifying root cause, 34–35
 - replacing, 32–33
- Excel files, connecting to, 2–3
- explicit measures, 209
- exporting
 - PBIDS file, 24–25
 - report data, 194
- expression-based formatting, 156–158

F

- files
 - connecting to, 2–3
 - format consistency, 5

- importing visuals, 156
- PBIDS, exporting, 24–25
- RDL (Report Definition Language), 171
- filters
 - adding, 117
 - Filters pane, 159–161
 - removing, 117–118
 - slicers, 158–159
 - Top N, 206–207
 - updating, 118–119
- flat schema, 68–69
- folders, connecting to, 4
- formatting
 - expression-based, 156–158
 - reports, 164–165
 - visuals, 154
- functions
 - CALCULATE, 116, 124
 - adding filters, 117
 - context transition, 119–122
 - removing filters, 117–118
 - updating filters, 118–119
 - CALENDAR, 93
 - CALENDARAUTO, 93
 - creating, 23–24
 - CROSSFILTER, 85
 - DISTINCT, 98
 - DIVIDE, 115
 - RELATED, 101–102
 - SUM, 125
 - Table Schema, 30
 - Time Intelligence, 122–124
 - UNION, 99
 - USERRELATIONSHIP, 81–82
- funnel charts, 148

G-H-I

- gauge charts, 152–153
- hierarchies, creating, 99–100
- icons, conditional formatting, 205–206
- impact analysis, 237
- importing, visuals, 155
 - from AppSource, 155
 - from a file, 156
- interactive visuals, 193–194

J-K

- joins, 38
 - keys, 38
- Key influencers visual, 219–221
- keys
 - for joins, 38
 - for relationships, 39
- KPI visual, 153–154

L

- line charts, 145
- Live Connection, 9, 11
- local datasets, 7–8

M

- M (“mashup”), 31
 - writing queries, 55–56
- managing datasets, 229
 - accessing on-premises data, 230–231
 - assigning roles in the Power BI service, 232–234
 - configuring scheduled refresh, 231–232
 - enabling large dataset format, 244–246
 - impact analysis, 237
 - incremental refresh settings, 238
 - creating the RangeStart and RangeEnd parameters, 238–239
 - filtering by using the RangeStart and RangeEnd parameters, 239–240
 - policies, 241–242
 - permissions, 236–237
 - query folding, 242
 - RLS (row-level security) group membership, 232
 - sharing through a workspace, 235
 - sharing through an app, 235–236
 - viewing as roles in the Power BI service, 234–235
- many-to-many relationships
 - bridge tables, 90–91
 - direct, 88
 - resolving, 87–88
- maps, 151–152
- markers, 166

- measures, 124–125, 129–130, 209. *See also* quick measures
 - explicit, 114, 209
 - implicit, 113–114
 - precalculating, 99
 - semi-additive, creating, 125–128
- merges, 38, 52–55. *See also* joins
- Microsoft Dataverse, connecting to, 19
- mobile devices, designing reports, 195
- multi-row card visual, 153–154

N

- naming conventions, query, 55
- navigation
 - apps, 252–253
 - reports, 186–187
- null values, 33

O-P

- OData feed, connecting to, 16
- outliers, identifying, 215–217
- paginated reports, 170–172
- parameters
 - development lifecycle strategy, 248–249
 - query, 19
 - creating, 19–20
 - editing, 22–23
 - multiple, 22
 - using, 21–22
- parent-child hierarchies, 76–79
- PBIDS file, exporting, 24–25
- performance, and visuals, 154
- personalizing visuals, 214–215
- pie charts, 149–150
- pivoting/unpivoting columns, 44–45
- Power BI, 1. *See also* DirectQuery
 - advanced analysis
 - binning, 219
 - grouping, 217
 - identifying outliers, 215–217
 - AI (artificial intelligence), 201
 - Assume Referential Integrity setting, 83
 - changing data source settings, 6

- connecting to a data source, 2–5
 - Excel files, 2–3
 - folders, 4
 - XMLA (XML for Analysis) endpoint, 26–27
 - Data source settings window, 6
 - datasets
 - published, 8
 - selecting, 7–8
 - DAX (data analysis expressions), 67
 - development lifecycle strategy, 248
 - DirectQuery, 10
 - composite models, 11–12
 - Live Connection, 9, 11
 - dynamic row-level security, 106–108
 - gateway modes, 230
 - getting data from different sources, 1
 - importing data, 9–10
 - incremental refresh, 18
 - Insert ribbon, 142–143
 - PBIDS file, exporting, 24–25
 - Q&A feature, 108–110, 177
 - synonyms, 111–112
 - Teach Q&A window, 110–111
 - query diagnostics toolset, 16–18
 - Quick Insights, 210–211
 - quick measures, 73–76
 - reports, 141
 - adding visualization items, 142–143
 - RLS (row-level security), 97, 102–103
 - roles, creating, 103–105
 - selecting a storage mode, 9
 - Selection pane, 190–191
 - storage mode, 86
 - changing, 12
 - composite models, 11–12
 - imported data, 9–10
 - Live Connection, 11
 - subscriptions, 257–258, 259
 - templates, 19
 - viewing data as roles, 105–106
- Power BI Report Builder, 171
- Power Platform, 18–19
- Power Query, 31, 208
 - Advanced Editor, 55–56
 - automatic type detection, disabling, 35
 - caching, 37
 - calendar tables, creating, 92–93
 - columns
 - adding, 46–48
 - combining, 39–40
 - pivoting/unpivoting, 44–45
 - data loading, 58–59
 - errors, identifying root cause, 34–35
 - Formula bar, 56–58
 - joins, 38
 - keys, 38
 - merges, 38
 - null values, 33
 - queries
 - appending, 50–52
 - combining, 50
 - merging, 52–55
 - naming conventions, 55
 - query steps, 41
 - editing, 42
 - reducing rows and columns, 42–44
 - replacing values, 32–33
 - resolving data import errors, 59–61
 - rows, removing, 34
 - transforming column data types, 35–37
 - using locale, 37–38
 - Transpose feature, 45–46
- Power Query Editor, 5
 - data profiling
 - examine data structures and interrogate column properties, 28–30
 - identifying data anomalies, 27–28
 - interrogate data statistics, 30–31
 - dataflows, creating, 25–26
 - functions, creating, 23–24
 - Native Query window, 15–16
 - queries
 - dependencies, 6
 - parameters, 19–20, 21–22
 - query folding, 15
 - recorded traces, 16–18
 - refreshing previews of queries, 4
 - Table Schema function, 30
- profiling data. *See* data profiling
- properties
 - column, 72–73
 - expression-based formatting, 156–158
 - table, 71–72
- publishing assets in a workspace, 255–256
- Python visuals, 161–164

Q

- Q&A feature, 108–110, 177
 - synonyms, 111–112
 - Teach Q&A window, 110–111
 - top N analysis, 207
- queries, 12. *See also* DirectQuery; Power Query; Power Query Editor
 - appending, 50–52
 - combining, 50
 - converting to functions, 23–24
 - dependencies, 6
 - merging, 52–55
 - naming conventions, 55
 - parameters, 19
 - creating, 19–20
 - editing, 22–23
 - multiple, 22
 - type, 21
 - using, 21–22
 - Targets, 48–50
 - Targets for 2020, 46–48
 - top N analysis, 207
 - writing, 55–56
- query folding, 242
- Quick Insights, 210–211
- quick measures, 73–76
 - CALCULATE function, 116
 - adding filters, 117
 - removing filters, 117–118
 - complex, 113–116
 - creating, 113
 - updating filters, 118–119

R

- R visuals, 161–164
- RDL (Report Definition Language) files, 171
- reference lines, 211–212
- RELATED function, 101–102
- relationships, 70, 82–83, 86–87, 129–130
 - cardinality, 83–84, 87
 - cross-filter direction, 84–85
 - direct many-to-many, 88
 - keys, 39
 - many-to-many, 84
 - bridge tables, 90–91
 - direct, 88
 - resolving, 87–88
 - many-to-one, 83
 - one-to-one, 83
 - role-playing dimensions, 79–82
- removing
 - columns, 129
 - conditional formatting, 202
 - rows, 34, 128–129
- replacing, values, 32–33
- reports, 141. *See also* data visualization; visuals
 - accessibility, 165–166
 - alt text, 166
 - markers, 166
 - page names, titles, and labels, 166
 - tab order, 167
 - theme and color selection, 167–168
 - automatic page refresh, 168
 - change detection, 169–170
 - fixed interval, 168–169
 - bookmarks, 180–183
 - custom tooltips, 183–185
 - designing for mobile devices, 195
 - editing interactions between visuals, 185–186
 - enriching for usability, 180
 - exporting data, 194
 - formatting, 164–165
 - navigation, 186–187
 - paginated, 170–172
 - subscriptions, 257–258, 259
 - top N analysis, 206
 - DAX (data analysis expressions), 207–208
 - Q&A, 207
 - visual-level filter, 206–207
- visuals
 - adding, 142–143
 - area charts, 145
 - bar charts, 144
 - card, 153–154
 - combo charts, 145–146
 - donut charts, 149–150
 - formatting, 154
 - funnel charts, 148
 - gauge charts, 152–153
 - KPI, 153–154
 - line charts, 145
 - maps, 151–152
 - multi-row card, 153–154
 - pie charts, 149–150
 - ribbon charts, 146–147
 - scatter charts, 149
 - treemap charts, 150–151
 - waterfall charts, 147–148

resolving, many-to-many relationships

- resolving, many-to-many relationships, 87–88
- ribbon charts, 146–147
- RLS (row-level security), 97, 102–103, 232, 251
 - and workspace roles, 235
- role-playing dimensions, 79–82
- roles
 - assigning in the Power BI service, 232–234
 - creating, 103–105
 - viewing data as, 105–106
 - workspace, 235, 250–251
- rows
 - dynamic row-level security, 106–108
 - reducing, 42–44
 - removing, 34, 128–129

S

- scatter charts, 149
 - identifying outliers, 215–217
- schema
 - flat, 68–69
 - snowflake, 70–71
 - star, 69–70
- security filters, 97
- semi-additive measures, creating, 125–128
- sensitivity labels, 256–257
- shared datasets, selecting, 7–8
- sharing datasets
 - through a workspace, 235
 - through an app, 235–236
- slicers, 158–159
 - hidden, 189
 - syncing, 188–190
- snowflake schema, 70–71
- sorting, visuals, 187–188
- star schema, 69–70
- statistical summary, 208–209
- storage mode. *See also* DirectQuery
 - composite models, 11–12
 - DirectQuery, 10
 - imported data, 9–10
 - Live Connection, 11
- subscriptions, 257–258, 259
- SUM function, 125
- synonyms, 111–112

T

- Table Schema function, 30
- tables, 71. *See also* columns; rows
 - calculated, 97
 - calendar
 - creating in DAX, 93–94
 - creating in Power Query, 92–93
 - cloning, 98
 - conditional formatting, 202
 - background color and font color, 202–204
 - data bars, 204–205
 - icons, 205–206
 - creating, 98–99
 - data granularity, 94–96
 - data shape transformations, 40–41
 - defining, 68
 - joins, 38
 - keys, 38
 - pivoting/unpivoting columns, 44–45
 - profiling, 31
 - properties, 71–72
 - reducing rows and columns, 42–44
 - relationships, 70, 82–83, 86–87
 - cardinality, 83–84, 87
 - cross-filter direction, 84–85
 - direct many-to-many, 88
 - keys, 39
 - many-to-many, 87–88
 - role-playing dimensions, 79–82
 - schema
 - flat, 68–69
 - snowflake, 70–71
 - star, 69–70
- Targets for 2020 query, 46–48
- Targets query, 48–50
- templates, 19
- themes, dashboard, 178–179
- tiles, 172–174
- Time Intelligence functions, 122–124
- time-series analysis, 212–214
- top N analysis, 206
 - DAX (data analysis expressions), 207–208
 - Q&A, 207
 - visual-level filter, 206–207
- treemap charts, 150–151

U-V

- UNION function, 99
- USERRELATIONSHIP function, 81–82
- values
 - null, 33
 - replacing, 32–33
- variables, 116
- viewing, data as roles, 105–106
- visual-level filter, 206–207
- visuals, 129–130. *See also* charts
 - artificial intelligence, 154
 - card, 153–154
 - conditional formatting, 206
 - conducting time-series analysis, 212–214
 - cross-filter, 191–193
 - dashboards, 172
 - data alerts, 176–177
 - mobile view, 174–176
 - pinning a live report page, 179
 - Quick Insights, 210–211
 - themes, 178–179
 - tiles, 172–174
 - Decomposition tree, 222
 - designing for accessibility, 165–166
 - alt text, 166
 - markers, 166
 - tab order, 167
 - theme and color selection, 167–168
 - drill-through, 191–193
 - editing interactions between, 185–186
 - expression-based formatting, 156–158
 - filters
 - Filters pane, 159–161
 - slicers, 158–159
 - formatting, 154
 - grouping, 191
 - importing, 155
 - from AppSource, 155
 - from a file, 156
 - interactive, 193–194
 - Key influencers, 219–221
 - KPI, 153–154
 - maps, 151–152

- multi-row card, 153–154
 - and performance, 154
 - personalizing, 214–215
 - Python, 161–164
 - R, 161–164
- reference lines, 211–212
- renaming, 190
- reports
 - bookmarks, 180–183
 - custom tooltips, 183–185
 - navigation, 186–187
- sorting, 187–188
- sync slicers, 188–190
- tables and matrixes
 - background color and font color, 202–204
 - conditional formatting, 202
 - data bars, 204–205
 - icons, 205–206
 - top N analysis, 206

W

- waterfall charts, 147–148
- WideWorldImporters.xlsx, connecting to, 2–3
- workspaces, 246
 - apps, 251, 254
 - navigation, 252–253
 - permissions, 253–254
 - setup, 252
 - unpublishing, 255
 - updating, 255
 - creating, 246–248
 - publishing assets, 255–256
 - RLS (row-level security), 251
 - roles, 250–251
 - sensitivity labels, 256–257
- writing, queries, 55–56

X-Y-Z

- XMLA (XML for Analysis) endpoint, connecting to a dataset, 26–27