Switch to pgAdmin, and in the object browser, expand the analysis node and continue expanding by selecting Schemas public Tables. Refresh your tables by right-clicking Tables and selecting Refresh from the pop-up menu. You should see us_counties_2019_shp listed. Congrats! You've loaded your shapefile into a table. As part of the import, the shapefile loader also indexed the geom column. You can move ahead to the section "Exploring the Census 2019 Counties Shapefile."

Importing Shapefiles using shp2pgsql

The Shapefile Import/Export Manager isn't available on all PostGIS distributions for macOS and Linux. For that reason, I'll show you how to import shapefiles using the PostGIS command line tool <code>shp2pgsql</code>, which lets you accomplish the same thing using a single text command.

On macOS and Linux, you execute command line tools in the Terminal application. If you're not familiar with working on the command line, you may want to pause here and read Chapter 18, "Using PostgreSQL from the Command Line," to get set up. Otherwise, on macOS launch Terminal from your Applications folder (under Utilities); on Linux, open your distribution's terminal.

At the command line, you use the following syntax to import a shapefile into a new table; the italicized code here are placeholders:

```
shp2pgsql -I -s SRID -W encoding shapefile_name table_name | psql -d database -U user
```

A lot's happening here. Let's look at each argument following the command:

- -I adds an index on the new table's geometry column using GiST.
- -s lets you specify an SRID for the geometric data.
- -w lets you specify file encoding, if necessary.

shapefile_name is the name (including full path) of the file ending with the .shp extension.

table_name indicates the new table you want the shapefile imported to.

Following these arguments, you place a pipe symbol (1) to direct the output of shp2pgsql to psql, the PostgreSQL command line utility. That's followed by arguments for naming the database and user. For example, to load the $tl_2019_us_county.shp$ shapefile from the book's resources into a us_counties_2019_shp table in the analysis database, in your terminal you would move to the directory containing the shapefile and run the following command (all on one line):

```
shp2pgsql -I -s 4269 -W LATIN1 tl_2019_us_county.shp us_counties_2019_shp | psql -d analysis -U postgres
```

The server should respond with a number of SQL INSERT statements before creating the index and returning you to the command line. It might take some time to construct the entire set of arguments the first time around. But after you've done one, subsequent imports should take less time because you can simply substitute file and table names into the syntax you already wrote.

Load your shapefile, and then you'll be ready to explore the data with queries.

Exploring the Census 2019 Counties Shapefile

Your new us_counties_2019_shp table contains columns including each county's name as well as the *Federal Information Processing Standards* (*FIPS*) codes uniquely assigned to each state and county. The geom column contains the spatial data for each county's boundary. To start, let's check what kind of spatial object geom contains using the ST_AsText() function. Use the code in *Listing_15-14* to show the WKT representation of the first geom value in the table.

```
SELECT ST_AsText(geom)
FROM us_counties_2019_shp
ORDER BY gid
LIMIT 1;
```

Listing 15-14: Checking the geom column's WKT representation

The result is a MultiPolygon with hundreds of coordinate pairs. Here's a portion of the output:

```
MULTIPOLYGON(((-97.019516 42.004097,-97.019519 42.004933,-97.019527 42.007501,-97.019529 42.009755,-97.019529 42.009776,-97.019529 42.009939,-97.019529 42.010163,-97.019538 42.013931,-97.01955 42.014546,-97.01955 42.014565,-97.019551 42.014608,-97.019551 42.014632,-97.01958 42.016158,-97.019622 42.018384,-97.019629 42.018545,-97.01963 42.019475,-97.01963 42.019553,-97.019644 42.020927, --snip-- )))
```

Each coordinate pair marks a Point on the boundary of the county, and remember that a MULTIPOLYGON object can contain a set of polygons. In the case of US counties, that will enable storage of counties whose boundaries contain more than one distinct, separated area. Now, you're ready to analyze the data.

Finding the Largest Counties in Square Miles

Which county can claim the title of largest in area? To find the answer, Listing 15-15 uses the ST_Area() function, which returns the area of a Polygon or MultiPolygon object. If you're working with a geography data type, ST_Area() returns the result in square meters. With a geometry data type—as used with this shapefile—the function returns the area in SRID units. Typically, those units are not useful for practical analysis, so we'll cast the geometry type to geography to obtain square meters. It's an intensive calculation, so expect extra time for this query to complete.

```
SELECT name,
statefp AS st,
round(

(ST_Area(1geom::geography) / 22589988.110336
)::numeric, 2

) AS 3square_miles
FROM us_counties_2019_shp

ORDER BY square_miles 4DESC
LIMIT 5;
```

Listing 15-15: Finding the largest counties by area using ST Area()

The geom column is data type geometry, so to find the area in square meters, we cast the geom column to a geography data type using the double-colon syntax 1. Then, to get square miles, we divide the area by 2589988.110336, which is the number of square meters in a square mile 2. To make the result easier to read, I've wrapped it in a round() function and named the resulting column square_miles 3. Finally, we list the results in descending order from the largest area to the smallest 4 and use LIMIT 5 to show the first five results, which should look like this:

name	st	square_miles
Yukon-Koyukuk	02	147871.00
North Slope	02	94827.92
Bethel	02	45559.08
Northwest Arctic	02	40619.78
Valdez-Cordova	02	40305.54

Congratulations to Alaska, where the boroughs (the name for county equivalents up there) are big. The five largest are all in Alaska, denoted by the state FIPS code 02. Yukon-Koyukuk, located in the heart of Alaska, is more than 147,800 square miles. (Keep that information in mind for the "Try It Yourself" exercise at the end of the chapter.)

Note that the shapefile doesn't include a state name, just its FIPS code. Because the spatial data resides in a table, in the next section we'll join to another census table to obtain the state name.

Finding a County by Longitude and Latitude

If you've ever wondered how spammy online ads seem to know where you live ("This one trick helped a Boston man fix his old shoes!"), it's thanks to *geolocation services* that use various means, such as your phone's GPS, to find your longitude and latitude. Given your coordinates, a spatial query can then determine which geography (a city or town, for example) that point falls into.

You can replicate this technique using your census shapefile and the ST_Within() function, which returns true if one geometry is inside another on the coordinate grid. *Listing 15-16* shows an example using the longitude and latitude of downtown Hollywood, California.

Listing 15-16: Using ST_Within() to find the county belonging to a pair of coordinates

The ST_Within() function 1 inside the WHERE clause requires two geometry inputs and evaluates whether the first is inside the second. For the function to work properly, both geometry inputs must have the same SRID. In this example, the first input is an extended WKT representation of a Point that includes the SRID 4269 (same as the census data), which is cast as a geometry type. The ST_Within() function doesn't accept a separate SRID input, so to set it for the supplied WKT, you must prefix it to the string like this: 'SRID=4269; POINT(-118.3419063 34.0977076)'. The second input is the geom column from the table.

Run the query; you should see the following result:

```
name state_name
-----
Los Angeles California
```

It shows that the Point you supplied is within Los Angeles county in California. We also see how this technique can gain value (or raise privacy concerns) by relating a Point to data about its surrounding area—as we did here by joining to county population estimates. Suddenly, we can tell a lot about someone based on data describing where they spend time.

Try supplying other longitude and latitude pairs to see which US county they fall in. If you provide coordinates outside the United States, the query should return no results because the shapefile contains only US areas.

Examining Demographics Within a Distance

A fundamental metric for planners trying to locate a new school, business, or other community amenity is the number of people who live within a certain distance of it. Will there be enough people nearby to make construction worthwhile? To find the answer, we can use spatial and demographics data to estimate the population contained in the geographies within a certain distance of the planned location.

Say we're considering building a restaurant in downtown Lincoln, Nebraska, and we want to understand how many people live within 50 miles of the potential location. The code in <u>Listing 15-17</u> uses the ST_DWithin() function to find counties that have any portion of their boundary within 50 miles of downtown Lincoln and sum their estimated 2019 population.

Listing 15-17: Using ST_DWithin() to count people near Lincoln, Nebraska

In <u>Listing 15-10</u>, we used ST_DWithin() to find farmers' markets close to Des Moines, Iowa. Here, we apply the same technique. We pass three arguments to ST_DWithin(): the census shapefile's geom column cast to the geography type; a point representing downtown Lincoln; and the distance of 50 miles using its equivalent in meters, 80,467.

The query should return a sum of 1,470,295, using the data from the joined census estimates table's pop_est_2019 column.

Say we want to list the county names and visualize their borders in pgAdmin; we can modify our query, as in <u>Listing 15-18</u>.

Listing 15-18: Displaying counties near Lincoln, Nebraska

This query should return 25 rows with the county name and its population. If you click the eye icon in the header of the geom column, you should see the counties displayed on a map in pgAdmin's Geometry Viewer, as in *Figure 15-6*.

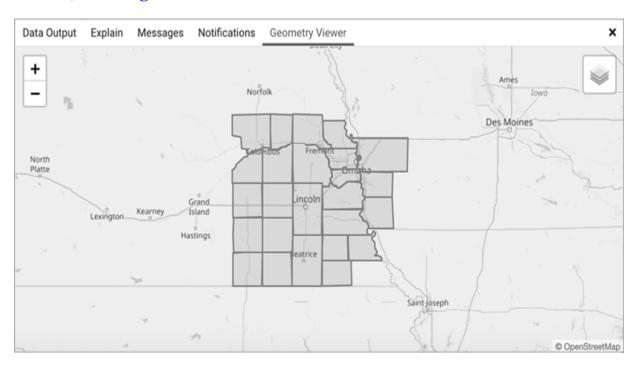


Figure 15-6: Counties that have a portion of their boundaries within 50 miles of Lincoln

These queries show counties that have any portion of their boundaries within 50 miles of Lincoln. Because counties tend to be large in area, they're a bit crude for determining an exact number of people within the distance of the point. For a more precise count, we could use smaller census geographies such as tracts or block groups, both of which are subcomponents of counties.

Finally, note that the pgAdmin Geometry Viewer's base map is the free OpenStreetMap, which uses the WGS 84 coordinate system. Our census shapefiles use a different coordinate system: North American Datum 83. For our data to display properly against the base map, we must use the ST_Transform() function 1 to convert the census geometry to the SRID of 4326. If we omit that function, the geographies will display on a blank canvas in the viewer because the coordinate systems don't match.

Performing Spatial Joins

Joining tables with spatial data opens up interesting opportunities for analysis. For example, you could join a table of coffee shops (which includes their longitude and latitude) to the counties table to find out how many shops exist in each county based on their location. In this section, we'll explore spatial joins with a detailed look at roads and waterways using census data.

Exploring Roads and Waterways Data

Much of the year, the Santa Fe River, which cuts through the New Mexico state capital, is a dry riverbed better described as an *intermittent stream*. According to the Santa Fe city website, the river is susceptible to flash flooding and was named the nation's most endangered river in 2007. If you were an urban planner, it would help to know where the river intersects roadways so you could plan for emergency response when it floods.

You can find these locations using another set of US Census TIGER/Line shapefiles that has details on roads and waterways in Santa Fe County. These shapefiles are also included with the book's resources. Download and unzip *tl_2019_35049_linearwater.zip* and *tl_2019_35049_roads.zip*, and then import both using the same steps from earlier in the chapter. Name the water table santafe_linearwater_2019 and the roads table santafe_roads_2019.

Next, refresh your database and run a quick SELECT * FROM query on both tables to view the data. You should have 11,655 rows in the roads table and 1,148 in the linear water table.

As with the counties shapefile, both tables have an indexed <code>geom</code> column of type <code>geometry</code>. It's helpful to check the type of spatial object in the column so you know the type of spatial feature you're querying. You can do that using the <code>ST_AsText()</code> function or <code>ST_GeometryType()</code>, as shown in <code>Listing 15-19</code>.

```
SELECT ST_GeometryType(geom)
FROM santafe_linearwater_2019
LIMIT 1;
SELECT ST_GeometryType(geom)
FROM santafe_roads_2019
LIMIT 1;
```

Listing 15-19: Using ST Geometry Type () to determine geometry

Both queries should return one row with the same value: ST_MultiLineString. That tell us that waterways and roads are stored as MultiLineString objects, a set of LineStrings that can be noncontinuous.

Joining the Census Roads and Water Tables

To find all the roads in Santa Fe that intersect the Santa Fe River, we'll join the roads and waterway tables with a query that tells us where the objects touch. We'll do this using the ST_Intersects() function, which returns a Boolean true if two spatial objects contact each other. Inputs can be either geometry or geography types. <u>Listing 15-20</u> joins the tables.

```
SELECT water.fullname AS waterway, 1
roads.rttyp,
roads.fullname AS road

FROM santafe_linearwater_2019 water JOIN santafe_roads_2019
roads 2
3 ON ST_Intersects(water.geom, roads.geom)

WHERE water.fullname = 4'Santa Fe Riv'
AND roads.fullname IS NOT NULL

ORDER BY roads.fullname;
```

Listing 15-20: Spatial join with ST_Intersects() to find roads crossing the Santa Fe River

The SELECT column list 1 includes the fullname column from the santafe_linearwater_2019 table, which gets water as its alias in the FROM 2 clause. The column list includes the rttyp code, which represents the route type, and fullname columns from the santafe_roads_2019 table, aliased as roads.

In the ON portion 3 of the JOIN construct, we use the ST_Intersects() function with the geom columns from both tables as inputs. Here, the expression evaluates as true if the geometries intersect. We use fullname to filter the results to show only those that have the full string 'Santa Fe Riv' 4, which is how the Santa Fe River is listed in the water table. We also eliminate instances where road names are NULL. The query should return 37 rows; here are the first five:

waterway	rttyp	road
Santa Fe Riv	М	Baca Ranch Ln
Santa Fe Riv	M	Baca Ranch Ln
Santa Fe Riv	M	Caja del Oro Grant Rd
Santa Fe Riv	M	Caja del Oro Grant Rd
Santa Fe Riv	M	Cam Carlos Rael
snip		

Each road in the results intersects with a portion of the Santa Fe River. The route type code for each of the first results is M, which indicates that the road name shown is its *common* name as opposed to a county or state recognized name, for example. Other road names in the complete results carry route types of C, S, or U (for unknown). The full route type code list is available at https://www.census.gov/library/reference/code-lists/route-type-codes.html.

Finding the Location Where Objects Intersect

We successfully identified roads that intersect the Santa Fe River. That's good, but it would really help to know the precise location of each intersection. We can modify the query to include the ST_Intersection() function, which returns the location of the place where objects touch. I've added it as a column in *Listing 15-21*.

```
SELECT water.fullname AS waterway,
roads.rttyp,
roads.fullname AS road,

1 ST_AsText(ST_Intersection(2water.geom, roads.geom))
FROM santafe_linearwater_2019 water JOIN santafe_roads_2019
roads
ON ST_Intersects(water.geom, roads.geom)
WHERE water.fullname = 'Santa Fe Riv'
AND roads.fullname IS NOT NULL
ORDER BY roads.fullname;
```

Listing 15-21: Using ST_Intersection() to show where roads cross the river

The function returns a geometry object, so to view its WKT representation, we must wrap it in ST_AsText() 1. The ST_Intersection() function takes two inputs: the geom columns 2 from both the water and roads tables. Run the query, and the results should now include the exact coordinate location, or locations, where the river crosses the roads (I've rounded the Point coordinates for brevity).

Much better than poring over a map with a pencil, and this might prompt more ideas for analyzing spatial data. For example, if you have a shapefile of building footprints, you could find buildings near the river and in danger of flooding during heavy rains. Governments and private organizations regularly use these techniques as part of their planning process.

Wrapping Up

Mapping is a powerful analysis tool, and the techniques you learned in this chapter give you a strong start toward exploring more with PostGIS. You may indeed want to visualize this data, and that's entirely possible with a GIS application such as Esri's ArcGIS (https://www.esri.com/) or the free open source QGIS (https://qgis.org/). Both can use a PostGIS-enabled PostgreSQL database as a data source, allowing you to visualize shapefile data in your tables or the results of queries.

You've now added working with geographic data to your analysis skills. Next, we'll explore another widely used data type called JavaScript Object Notation (JSON) and how PostgreSQL enables storing and querying it.

TRY IT YOURSELF

Use the spatial data you've imported in this chapter to try additional analysis:

Earlier, you found which US county has the largest area. Now, aggregate the county data to find the area of each state in square miles. (Use the <code>statefp</code> column in the <code>us_counties_2019_shp</code> table.) How many states are bigger than the Yukon-Koyukuk area?

Using ST_Distance(), determine how many miles separate these two farmers' markets: The Oakleaf Greenmarket (9700 Argyle Forest Blvd, Jacksonville, Florida) and Columbia Farmers Market (1701 West Ash Street, Columbia, Missouri). You'll need to first find the coordinates for both in the farmers_markets table. Tip: you can also write this query using the Common Table Expression syntax you learned in Chapter 13.

More than 500 rows in the <code>farmers_markets</code> table are missing a value in the <code>county</code> column, which is an example of dirty government data. Using the <code>us_counties_2019_shp</code> table and the <code>st_Intersects()</code> function, perform a spatial join to find the missing county names based on the longitude and latitude of each market. Because <code>geog_point</code> in <code>farmers_markets</code> is of the <code>geography</code> type and its SRID is <code>4326</code>, you'll need to cast <code>geom</code> in the census table to the <code>geography</code> type and change its SRID using <code>st_setsrip()</code>.

The nyc_yellow_taxi_trips table you created in Chapter 12 contains the longitude and latitude where each trip began and ended. Use PostGIS functions to turn the drop-off coordinates into a geometry type and count the state/county pairs where each drop-off occurred. As with the previous exercise, you'll need to join to the us_counties_2019_shp table and use its geom column for the spatial join.

16 WORKING WITH JSON DATA



JavaScript Object Notation (JSON) is a widely used text format for storing data in a platform-independent way so it can be shared between computer systems. In this chapter, you'll learn the structure of

JSON as well as how to store and query JSON data types in PostgreSQL. After we explore PostgreSQL's JSON query operators, we'll analyze a month's worth of data about earthquakes.

The American National Standards Institute (ANSI) SQL standard added syntax definitions for JSON and specified functions for creating and accessing JSON objects in 2016. Major database systems have added JSON support in recent years as well, although implementations vary. PostgreSQL, for example, supports some of the ANSI standard while implementing a number of nonstandard operators. I'll note which aspects of PostgreSQL's JSON support are part of standard SQL as we work through exercises.

Understanding JSON Structure

JSON data primarily comprises two structures: an *object*, which is an unordered set of name/value pairs, and an *array*, which is an ordered

collection of values. If you've used programming languages such as JavaScript, Python, or C#, these aspects of JSON should look familiar.

Inside an object, we use name/value pairs as a structure for storing and referencing individual data items. The object in its entirety is enclosed within curly brackets, and each name, more often referred to as a *key*, is enclosed in double quotes, followed by a colon and its corresponding value. The object can encapsulate multiple key/value pairs, separated by commas. Here's an example using movie information:

```
{"title": "The Incredibles", "year": 2004}
```

The keys are title and year, and their values are "The Incredibles" and 2004. If the value is a string, it goes in double quotes. If it's a number, a Boolean value, or a null, we omit the quotes. If you're familiar with the Python language, you'll recognize this structure as a *dictionary*.

An array is an ordered list of values enclosed in square brackets. We separate each value in the array with a comma. For example, we might list movie genres like so:

```
["animation", "action"]
```

Arrays are common in programming languages, and we've used them already in SQL queries. In Python, this structure is called a *list*.

We can create many permutations of these structures, including nesting objects and arrays inside each other. For example, we can create an array of objects or use an array as the value of a key. We can add or omit key/value pairs or create additional arrays of objects without violating a preset schema. This flexibility—in contrast to the strict definition of a SQL table—is both part of the appeal of using JSON as a data store as well as one of the biggest difficulties in working with JSON data.

As an example, <u>Listing 16-1</u> shows information about two of my favorite films stored as JSON. The outermost structure is an array with two elements —one object for each film. We know the outermost structure is an array because the entire JSON begins and ends with square brackets.

```
[ { 1
    "title": "The Incredibles",
    "year": 2004,
  2"rating": {
        "MPAA": "PG"
    },
  3"characters": [{
        "name": "Mr. Incredible",
        "actor": "Craig T. Nelson"
    }, {
        "name": "Elastigirl",
        "actor": "Holly Hunter"
    }, {
        "name": "Frozone",
        "actor": "Samuel L. Jackson"
    } ],
 4"genre": ["animation", "action", "sci-fi"]
}, {
    "title": "Cinema Paradiso",
    "year": 1988,
    "characters": [{
        "name": "Salvatore",
        "actor": "Salvatore Cascio"
    }, {
        "name": "Alfredo",
        "actor": "Philippe Noiret"
    }],
    "genre": ["romance", "drama"]
} ]
```

Listing 16-1: JSON with information about two films

Inside the outermost array, each film object is surrounded by curly brackets. The open brace at 1 starts the object for the first film *The Incredibles*. For both films, we store the title and year as key/value pairs, and they have string and integer values, respectively. The third key, rating 2, has a JSON object for its value. That object contains a single key/value pair showing the film's rating from the Motion Picture Association of America.

Here we can see the flexibility JSON affords us as a storage medium. First, if we later wanted to add another country's rating for the film, we could easily add a second key/value pair to the rating value object.

Second, we're not required to include rating—or any key/value pair—in every film object. In fact, I omitted a rating for *Cinema Paradiso*. If a particular piece of data isn't available, in this case a rating, some systems that generate JSON might simply exclude that pair. Other systems might include rating but with a null value. Both are valid, and that flexibility is one of JSON's advantages: its data definition, or *schema*, can flex as needed.

The final two key/value pairs show other ways to structure JSON. For characters 3, the value is an array of objects, with each object surrounded by curly brackets and separated by a comma. The value for genre 4 is an array of strings.

Considering When to Use JSON with SQL

There are advantages to using *NoSQL* or *document* databases that store data in JSON or other text-based data formats, as opposed to the relational tables SQL uses. Document databases are flexible in terms of data definitions. You can redefine a data structure on the fly if needed. Document databases are often also used for high-volume applications because they can be scaled by adding servers. On the flip side, you may give up SQL advantages such as easily added constraints that enforce data integrity and support for transactions.

The arrival of JSON support in SQL has made it possible to enjoy the best of both worlds by adding JSON data as columns in relational tables. The decision to use a SQL or NoSQL database should be multifaceted. PostgreSQL performs favorably relative to NoSQL in terms of speed, but we must also consider the kinds and volume of data being stored, the applications being served, and more.

That said, some cases where you might want to take advantage of JSON in SQL include the following:

When users or applications need to arbitrarily create key/value pairs. For example, if tagging a collection of medical research papers, one user might want to add a key to track chemical names, and another user might want a key to track food names.

When storing related data in a JSON column instead of a separate table. An employees table could have the usual columns for name and contact information plus a JSON column with a flexible collection of key/value pairs that might hold additional attributes that don't apply to every employee, such as company awards or performance metrics.

When saving time by analyzing JSON data fetched from other systems without first parsing it into a set of tables.

Keep in mind that using JSON in PostgreSQL or other SQL databases can also present challenges. Constraints that are trivial to set up on regular SQL tables can be more difficult to set and enforce on JSON data. JSON data can consume more space as key names get repeated in text along with the quotes, commas, and braces that define its structure. Finally, the flexibility of JSON can create issues for the code that interacts with it—whether SQL or another language—if keys unexpectedly disappear or the data type of a value changes.

Keeping all this in mind, let's review PostgreSQL's two JSON data types and load some JSON into a table.

Using json and jsonb Data Types

PostgreSQL provides two data types for storing JSON. Both allow insertion of valid JSON only—text that includes required elements of the JSON specification, such as open and closing curly brackets around an object, commas separating objects, and proper quoting of keys. If you try to insert invalid JSON, the database will generate an error.

The main difference between the two is that one stores JSON as text and the other as binary data. The binary implementation is newer to PostgreSQL and generally preferred because it's faster at querying and has indexing capabilities.

The two types are as follows:

json

Stores JSON as text, keeping white space and maintaining the order of keys. If a single JSON object contains a particular key more than once (which is valid), the <code>json</code> type will preserve each of the repeated key/value pairs. Finally, each time a database function processes <code>json-stored</code> text, it must parse the object to interpret its structure. This can make reads from the database slower than with the <code>jsonb</code> type. Indexing is not supported. Typically, the <code>json</code> type is useful when an application has duplicate keys or needs to preserve the order of keys.

jsonb

Stores JSON in a binary format, removing white space and not maintaining the order of keys. If a single JSON object contains a particular key more than once, the <code>jsonb</code> type will preserve only the last of the key/value pairs. The binary format adds some overhead to writing data to the table, but processing is faster. Indexing is supported.

Neither json nor jsonb is part of the ANSI SQL standard, which doesn't specify a JSON data type and leaves it to database makers to decide how to implement support. The PostgreSQL documentation at https://www.postgresql.org/docs/current/datatype-json.html recommends using jsonb unless there's a need to preserve the order of key/value pairs.

We'll use jsonb exclusively in the remainder of the chapter, both because of speed considerations but also because many of PostgreSQL's JSON functions work the same way with both json and jsonb—and there are more functions available for jsonb. We'll continue by adding the films JSON from <u>Listing 16-1</u> to a table and exploring JSON query syntax.

Importing and Indexing JSON Data

The file *films.json* in the Chapter 16 folder of the book's resources at https://nostarch.com/practical-sql-2nd-edition/ contains a modified form of the JSON in Listing 16-1. View the file with a text editor, and you'll see each film's JSON object is placed on a single line, with no line breaks between elements. I've also removed the outermost square brackets and the comma separating the two film objects. Each remains a valid JSON object:

```
{"title": "The Incredibles", "year": 2004, --snip-- } {"title": "Cinema Paradiso", "year": 1988, --snip-- }
```

I set up the file this way so that PostgreSQL's COPY command will interpret each film's JSON object as a separate row on import, the same way it does when importing a CSV file. The code in <u>Listing 16-2</u> makes a simple films table with a surrogate primary key and a jsonb column called film.

```
CREATE TABLE films (
    id integer GENERATED ALWAYS AS IDENTITY PRIMARY KEY,
    film jsonb NOT NULL
);

COPY films (film)

1 FROM C:\YourDirectory\films.json';

2 CREATE INDEX idx_film ON films USING GIN (film);
```

Listing 16-2: Creating a table to hold JSON data and adding an index

Note that the COPY statement ends with the FROM clause 1 instead of continuing to include a WITH statement as in previous examples. The reason we no longer need the WITH statement, which we've used to specify options for file headers and CSV formatting, is that this file has no header and isn't delimited. We just want the database to read each line and process it.

After import, we add an index 2 to the <code>jsonb</code> column using the GIN index type. We discussed the generalized inverted index (GIN) with full-text search in Chapter 14. GIN's implementation of indexing the location of words or key values within text is particularly suited to JSON data. Note that because index entries point to rows in a table, <code>jsonb</code> column indexing works best when each row contains a relatively small chunk of JSON—as opposed to a table with one row that has a single, enormous JSON value and repeated keys.

Execute the commands to create and fill the table and add the index. Run SELECT * FROM films; and you should see two rows containing the autogenerated id and the JSON object text. Now you're ready to explore querying the data using with PostgreSQL's JSON operators.

Using json and jsonb Extraction Operators

To retrieve values from our stored JSON, we can use PostgreSQL-specific *extraction operators*, which return either a JSON object, an element of an array, or an element that exists at a path in the JSON structure we specify. <u>Table 16-1</u> shows the operators and their functions, which can vary based on the data type of the input. Each works with json and jsonb data types.

Table 16-1: json and jsonb Extraction Operators

Operator, syntax	Function	Returns
json -> text	Extracts a key value, specified as text	json Or jsonb (matching the input)
jsonb -> text		
json ->> text	Extracts a key value, specified as text	text
<pre>jsonb ->> text</pre>		
json -> integer	Extracts an array element, specified as an integer denoting its array position	json or jsonb (matching the input)
jsonb -> integer		
json ->> integer	Extracts an array element, specified as an integer denoting its array position	text
<pre>jsonb ->> integer</pre>		
json #> text array	Extracts a JSON object at a specified path	json or jsonb (matching the input)
<pre>jsonb #> text array</pre>		
json #>> text array	Extracts a JSON object at a specified path	text
jsonb #>> text array		

Let's try the operators with our films JSON to learn more about how they vary in function.

Key Value Extraction

In <u>Listing 16-3</u> we use the -> and ->> operators followed by text naming the key value to retrieve. In that context, with text input, these are called *field* extraction operators because they extract a field, or key value, from the JSON. The difference between the two is that -> returns the key value as JSON in the same type as stored, and ->> returns the key value as text.

```
SELECT id, film ->1 'title' AS title
FROM films
ORDER BY id;

SELECT id, film ->>2 'title' AS title
FROM films
ORDER BY id;

SELECT id, film ->3 'genre' AS genre
FROM films
ORDER BY id;
```

Listing 16-3: Retrieving a JSON key value with field extraction operators

In the SELECT list, we specify our JSON column name followed by the operator and the key name in single quotes. In the first example, the syntax -> 'title' 1 returns the value of the title key as JSON in the same data type as stored, jsonb. Run the first query, and you should see the output like this:

```
id title
-- ------
1 "The Incredibles"
2 "Cinema Paradiso"
```

In pgAdmin, the data type listed in the title column header should indicate jsonb, and the film titles remain quoted, as they are in the JSON object.

Changing the field extraction operator to ->> 2 returns the film titles as text instead:

```
id title
-------
1 The Incredibles
2 Cinema Paradiso
```

Finally, we'll return an array. In our films JSON, the value of the key genre is an array of values. Using the field extraction operator -> 3 returns the array as jsonb:

```
id genre

1 ["animation", "action", "sci-fi"]
2 ["romance", "drama"]
```

If we used ->> here, we'd return the arrays as text. Let's look at how to extract elements from an array.

Array Element Extraction

To retrieve a specific value from an array, we follow the -> and ->> operators with an integer specifying the value's position, or *index*, in the array. We call these *element extraction operators* because they retrieve an element from a JSON array. As with field extraction, -> returns the value as JSON in the same type as stored, and ->> returns it as text.

Listing 16-4 shows four examples using the array values of "genre".

```
SELECT id, film -> 'genre' -> 01 AS genres
FROM films
ORDER BY id;

SELECT id, film -> 'genre' -> -12 AS genres
FROM films
ORDER BY id;

SELECT id, film -> 'genre' -> 23 AS genres
FROM films
ORDER BY id;

SELECT id, film -> 'genre' ->> 04 AS genres
```

Listing 16-4: Retrieving a JSON array value with element extraction operators

We must first retrieve the array value from the key as JSON and then retrieve the desired element from the array. In the first example, we specify the JSON column film, followed by the field extraction operator -> and the genre key name in single quotes. This returns the genre value as jsonb. We follow the key name with -> and the integer 0 1 to get the first element.

Why not use 1 for the first value in the array? In many languages, including Python and JavaScript, index values start at zero, and that's also true when accessing JSON arrays with SQL.

NOTE

SQL arrays have a different ordering scheme than JSON arrays in PostgreSQL. The first element in a SQL array is at position 1; in a JSON array, the first element is at position 0.

Run the first query, and your results should look like this, showing the first element in each film's genre array, returned as jsonb:

```
id genres
------
1 "animation"
2 "romance"
```

We can also access the last element of the array, even if we aren't sure of its index, because the number of genres per film can vary. We count backward from the end of the list using a negative index number. Supplying -1 2 tells -> to get the first element from the end of the list:

```
id genres
------
1 "sci-fi"
2 "drama"
```

We can count back further if we want—an index of -2 will get the next-to-last element.

Note that PostgreSQL won't return an error if there's no element at the supplied index position; it will simply return a NULL for that row. For example, if we supply 2 3 for the index, we see results for one of our films and a NULL for the other:

```
id genres
-- ------
1 "sci-fi"
2
```

We get a NULL back for *Cinema Paradiso* because it has only two elements in its genre value array, and index 2 (since we count up starting with zero) represents the third element. Later in the chapter, we'll learn how to count array lengths.

Finally, changing the element extraction operator to ->> 4 returns the desired element as a text data type rather than JSON:

```
id genres
-- -----
1 animation
2 romance
```

This is the same pattern as we saw when extracting key values: -> returns a JSON data type, and ->> returns text.

Path Extraction

Both #> and #>> are path extraction operators that return an object located at a JSON path. A path is a series of keys or array indices that lead to the location of a value. In our example JSON, it might be just the title key if we want the name of the film. Or it could be more complex, such as the characters key followed by an index value of 1, then the actor key; this would provide the path to the name of the actor at index 1. The #> path extraction operator returns a JSON data type matching the stored data, and #>> returns text.

Consider the MPAA rating for the film *The Incredibles*, which appears in our JSON like this:

```
"rating": {
    "MPAA": "PG"
}
```

The structure is a key named rating with an object for its value; inside that object is a key/value pair with MPAA as the key name. Thus, the path to the film's MPAA rating begins with the rating key and ends with the MPAA key. To denote the path's elements, we use the PostgreSQL string syntax for arrays, creating a comma-separated list inside curly brackets and single quotes. We then feed that string to the path extraction operators. <u>Listing 16-5</u> shows three examples of setting paths.

```
SELECT id, film #> '{rating, MPAA}'1 AS mpaa_rating FROM films
ORDER BY id;

SELECT id, film #> '{characters, 0, name}'2 AS name FROM films
ORDER BY id;

SELECT id, film #>> '{characters, 0, name}'3 AS name FROM films
ORDER BY id;
```

Listing 16-5: Retrieving a JSON key value with path extraction operators

To get each film's MPAA rating, we specify the path in an array: {rating, MPAA} 1 with each item separated by commas. Run the query, and you should see these results:

```
id mpaa_rating
-- -----
1 "PG"
2
```

The query returns the PG rating for *The Incredibles* and a NULL for *Cinema Paradiso* because, in our data, the latter film has no MPAA rating

present.

The second example works with the array of characters, which in our JSON looks like this:

```
"characters": [{
        "name": "Salvatore",
        "actor": "Salvatore Cascio"
}, {
        "name": "Alfredo",
        "actor": "Philippe Noiret"
}]
```

The characters array shown is for the second movie, but both films have a similar structure. Array objects each represent a character and the name and the actor who played them. To locate the name of the first character in the array, we specify a path 2 that starts at the characters key, continues to the first element of the array using the index 0, and ends at the name key. The query results should look like this:

```
id name
------
1 "Mr. Incredible"
2 "Salvatore"
```

The #> operator returns results as a JSON data type, in our case jsonb. If we want the results as text, we use #>> 3 with the same path.

Containment and Existence

The final collection of operators we'll explore performs two kinds of evaluations. The first concerns *containment* and checks whether a specified JSON value contains a second specified JSON value. The second tests for *existence*: whether a string of text within a JSON object exists as a top-level key (or as an element of an array nested inside a deeper object). Both kinds of operators return a Boolean value, which means we can use them in a where clause to filter query results.

This set of operators works only with the jsonb data type—another good reason to favor jsonb over json—and can make use of our GIN index for

efficient searching. <u>Table 16-2</u> lists the operators with their syntax and function.

 Table 16-2: jsonb
 Containment and Existence Operators

Operator, syntax	Function	Retu rns
jsonb @>	Tests whether the first JSON value contains the second JSON value	boole an
jsonb <@	Tests whether the second JSON value contains the first JSON value	boole an
jsonb ? text	Tests whether the text exists as a top-level (not nested) key or an array value	boole an
jsonb ? text array	Tests whether any of the text elements in the array exist as a top-level (not nested) key or as an array value	boole an
jsonb ?& text array	Tests whether all of the text elements in the array exist as a top-level (not nested) key or as an array value	boole an

Using Containment Operators

In <u>Listing 16-6</u>, we use @> to evaluate whether one JSON value contains a second JSON value.

Listing 16-6: Demonstrating the @> containment operator

In our SELECT list, we check whether the JSON stored in the film column in each row contains the key/value pair for *The Incredibles*. We use the @> containment operator 1 in an expression that generates a column with the Boolean result true if film contains "title": "The Incredibles". We give the name of our JSON column, film, then the @> operator, and then a string (cast to jsonb) specifying the key/value pair. In our SELECT list, we also return the text of the film title as a column. Running the query should produce these results:

```
id title is_incredible

1 The Incredibles true
2 Cinema Paradiso false
```

As expected, the expression evaluates to true for *The Incredibles* and false for *Cinema Paradiso*.

Because the expression evaluates to a Boolean result, we can use it in a query's WHERE 2 clause, as shown in <u>Listing 16-7</u>.

```
SELECT film ->> 'title' AS title,
film ->> 'year' AS year
FROM films

2 WHERE film @> '{"title": "The Incredibles"}'::jsonb;
```

Listing 16-7: Using a containment operator in a where clause

Here we again check that the JSON in the film column contains the key/value pair for the title of *The Incredibles*. By placing the evaluation in a where clause, the query should return just the row where the expression returns true:

```
title year
-----The Incredibles 2004
```

Finally, in <u>Listing 16-8</u>, we flip the order of evaluation to check whether the key/value pair specified is contained within the film column.

Listing 16-8: Demonstrating the <@ containment operator

Here we use the <@ operator 3 instead of @> to flip the order of evaluation. This expression also evaluates to true, returning the same result as the previous query.

Using Existence Operators

Next, in <u>Listing 16-9</u>, we explore three existence operators. These check whether the text we supply exists as a top-level key or as an element of an array. All return a Boolean value.

Listing 16-9: Demonstrating existence operators

The ? operator checks for the existence of a single key or array element. In the first query's where clause, we give the film column, the ? operator 1, and then the string rating. This syntax says, "In each row, does rating exist as a key in the JSON in the film column?" When we run the query, the results show the one film that has a rating key, *The Incredibles*.

The ?! and ?& operators act as or and and. For example, using ?! 2 tests whether either rating or genre exist as top-level keys. Running that second query returns both films, because both have at least one of those keys. Using ?& 3, however, tests whether both rating and genre exist as keys, and that's true for only *The Incredibles*.

All these operators provide options for fine-tuning your exploration of your JSON data. Now, let's use some of them on a larger dataset.

Analyzing Earthquake Data

In this section, we'll analyze a collection of JSON data about earthquakes compiled by the US Geological Survey, an agency of the US Department of the Interior that monitors natural phenomenon including volcanoes, landslides, and water quality. The USGS uses a network of seismographs that record the earth's vibrations, compiling data on each seismic event's location and intensity. Minor earthquakes occur around the world many times a day; the big ones are less frequent but potentially devastating.

For our exercise, I fetched a month's worth of JSON-formatted earthquake data from a USGS *application programming interface*, better known as an API. An *API* is a resource for transmitting data and commands between computers, and JSON is often used for APIs. You'll find the data in the file *earthquakes.json* in the folder for this chapter included in the book's resources.

Exploring and Loading the Earthquake Data

<u>Listing 16-10</u> shows the data structure for each earthquake record in the file, along with a selection of its key/value pairs (your *Chapter_16.sql* file has the nonsnipped version).

```
{
    "type": "Feature", 1
    "properties":2 {
        "mag": 1.44,
        "place": "134 km W of Adak, Alaska",
        "time": 1612051063470,
        "updated": 1612139465880,
        "tz": null,
        --snip--
        "felt": null,
        "cdi": null,
        "mmi": null,
        "alert": null,
        "status": "reviewed",
        "tsunami": 0,
        "sig": 32,
        "net": "av",
        "code": "91018173",
        "ids": ",av91018173,",
        "sources": ", av, ",
        "types": ", origin, phase-data, ",
```

```
"nst": 10,
    "dmin": null,
    "rms": 0.15,
    "gap": 174,
    "magType": "ml",
    "type": "earthquake",
    "title": "M 1.4 - 134 km W of Adak, Alaska"
},

"geometry":3 {
    "type": "Point",
    "coordinates": [-178.581, 51.8418333333333, 22.48]
},
    "id": "av91018173"
}
```

Listing 16-10: JSON with data on one earthquake

This data is in *GeoJSON* format, a JSON-based specification for spatial data. GeoJSON will include one or more Feature objects, denoted by inclusion of the key/value pair "type": "Feature" 1. Each Feature describes a single spatial object and contains both descriptive attributes (such as event time or related codes) under properties 2 plus a geometry 3 key that includes the coordinates of the spatial object. In our data, each geometry is a Point, a simple feature with the coordinates of one earthquake's longitude, latitude, and depth in kilometers. We discussed Points and simple features in Chapter 15 when working with PostGIS; GeoJSON incorporates it and other spatial simple features. You can read more about the GeoJSON specification at https://geojson.org/ and see definitions of the keys in the USGS documentation at https://earthquake.usgs.gov/data/comcat/data-eventterms.php/.

Let's load our data into a table called earthquakes using the code in *Listing 16-11*.

```
CREATE TABLE earthquakes (
    id integer GENERATED ALWAYS AS IDENTITY PRIMARY KEY,
    earthquake jsonb1 NOT NULL
);

COPY earthquakes (earthquake)
FROM C:\YourDirectory\earthquakes.json';
```

```
2 CREATE INDEX idx_earthquakes ON earthquakes USING GIN (earthquake);
```

Listing 16-11: Creating and loading an earthquakes table

As with our films table, we use COPY to copy the data into a single jsonb column 1 and add a GIN index 2. Running SELECT * FROM earthquakes; should return 12,899 rows. Now let's see what we can learn from the data.

Working with Earthquake Times

The time key/value pair represents the moment the earthquake occurred. In *Listing 16-12*, we retrieve the value of time using a path extraction operator.

```
SELECT id, earthquake #>> '{properties, time}'1 AS time FROM earthquakes ORDER BY id LIMIT 5;
```

Listing 16-12: Retrieving the earthquake time

In the SELECT list, we give the earthquake column followed by a #>> path extraction operator and the path 1 to the time value denoted as an array. The #>> operator will return our value as text. Running the query should return five rows:

```
id time
--------
1 1612137592990
2 1612137479762
3 1612136740672
4 1612136207600
5 1612135893550
```

If those values don't look like times to you, that's not surprising. By default, the USGS represents time as milliseconds since the Unix epoch at 00:00 UTC on January 1, 1970. That's a variant of the standard epoch time we covered in Chapter 12, which measures seconds since the epoch. We can convert this USGS time value to something understandable using to_timestamp() and a little math, as shown in <u>Listing 16-13</u>.

Listing 16-13: Converting the time value to a timestamp

Inside the parentheses of the to_timestamp() 1 function, we repeat the code to extract the time value. The to_timestamp() function requires a number representing seconds, but the extracted value is text and in milliseconds, so we also cast the extracted text to bigint and divide by 1,000 2 to convert it to seconds.

On my machine, the query generates the following results showing the extracted time value and its converted timestamp (your values will vary depending on your PostgreSQL server's time zone, so time_formatted will show when the earthquake occurred in your server's time zone time):

```
id time time_formatted

1 1612137592990 2021-01-31 18:59:52-05
2 1612137479762 2021-01-31 18:57:59-05
3 1612136740672 2021-01-31 18:45:40-05
4 1612136207600 2021-01-31 18:36:47-05
5 1612135893550 2021-01-31 18:31:33-05
```

Now that we have an understandable timestamp, let's find the oldest and newest earthquake times using the min() and max() aggregate functions in *Listing 16-14*.

```
)) AT TIME ZONE 'UTC' AS max_timestamp FROM earthquakes;
```

Listing 16-14: Finding the minimum and maximum earthquake times

We place to_timestamp() and our milliseconds-to-seconds conversion inside both the min() 1 and max() 3 functions in our SELECT list. This time, we add the keywords AT TIME ZONE 'UTC' 2 after both functions; regardless of our server time zone settings, the results will display the timestamps in UTC, as USGS records them. Your results should look like this:

This collection of earthquakes spans a month—from early morning January 1, 2021, through the end of day on January 31. That's helpful context as we continue to dig for usable information.

Finding the Largest and Most-Reported Earthquakes

Next, we'll look at two data points that measure an earthquake's size and the degree to which citizens reported feeling it and apply JSON extraction techniques to simple sorting of results.

Extracting by Magnitude

The USGS reports each earthquake's magnitude in the mag key, beneath properties. Magnitude, according to the USGS, is a number representing the size of an earthquake at its source. Its scale is logarithmic: a magnitude 4 earthquake has seismic waves whose amplitude is about 10 times bigger than a quake with a magnitude of 3. With that context, let's find the five largest earthquakes in our data using the code in *Listing 16-15*.

```
(earthquake #>> '{properties, mag}')::numeric AS
magnitude
FROM earthquakes

2 ORDER BY (earthquake #>> '{properties, mag}')::numeric3 DESC
NULLS LAST
LIMIT 5;
```

Listing 16-15: Finding the five earthquakes with the largest magnitude

We again use path extraction operators to retrieve our desired elements, including values for place 1 and mag. To show the largest five in our results, we add an ORDER BY clause 2 with mag. We cast the value to numeric 3 here and in the SELECT because we want to display and sort the value as a number rather than as text. We also add the DESC NULLS LAST keywords, which sorts the results in descending order and places NULL values (of which there are two) last. Your results should look like this:

place	time	
magnitude		
		10.00.01
211 km SE of Pondaguitan, Philippines	2021-01-21	12:23:04
South Shetland Islands	2021-01-23	23:36:50
6.9		
30 km SSW of Turt, Mongolia 6.7	2021-01-11	21:32:59
28 km SW of Pocito, Argentina	2021-01-19	02:46:21
6.4		
Kermadec Islands, New Zealand 6.3	2021-01-08	00:28:50

The largest, of magnitude 7, was located beneath the ocean southeast of the small city of Pondaguitan in the Philippines. The second was in the Antarctic near the South Shetland Islands.

Extracting by Citizen Reports

The USGS operates a Did You Feel It? website at https://earthquake.usgs.gov/data/dyfi/ where people can report their earthquake experiences. Our JSON includes the number of reports for each earthquake under the key felt, beneath properties. Let's see which

earthquakes in our data generated the most reports using the code in <u>Listing</u> 16-16.

Listing 16-16: Finding earthquakes with the most Did You Feel It? reports

Structurally, this query is similar to <u>Listing 16-15</u> that found the largest quakes. We add a path extraction operator for the felt 1 key, casting the returned text value to an integer type. We cast to integer so the extracted text is treated as a number for sorting and display. Finally, we place the extraction code in ORDER BY 2, using NULLS LAST because there are many earthquakes with no reports and we want those to appear last in the list. You should see these results:

place	time	magnitude	felt
4km SE of Aromas, CA 2km W of Concord, CA 10km NW of Pinnacles, CA 2km W of Willowbrook, CA 3km NNW of Santa Rosa, CA		3.63 4.32 3.52	00.0

The top five are in California, which makes sense. Did You Feel It? is a US government-run system, so we'd expect more US reports—particularly in earthquake-prone California. Also, some of the largest quakes in our data occurred beneath oceans or in remote regions. The quake with more than 19,900 reports was moderate, but its nearness to cities meant more chance for people to notice it.

Converting Earthquake JSON to Spatial Data

Our JSON data has longitude and latitude values for each earthquake, meaning we can perform spatial analysis using the GIS techniques discussed in Chapter 15. For example, we'll use a PostGIS distance function to locate earthquakes that occurred within 50 miles from a city. First, though, we must convert the coordinates stored in JSON to a PostGIS data type.

The longitude and latitude values are found in the array of the coordinates key, under geometry. Here's an example:

```
"geometry": {
    "type": "Point",
    "coordinates": [-178.581, 51.8418333333333, 22.48]
}
```

The first coordinate, at position 0 in the array, represents longitude; the second, at position 1, is latitude. The third value denotes depth in kilometers, which we won't use. To extract these elements as text, we make use of a #>> path operator, as in *Listing 16-17*.

```
SELECT id,
        earthquake #>> '{geometry, coordinates}' AS
coordinates,
        earthquake #>> '{geometry, coordinates, 0}' AS
longitude,
        earthquake #>> '{geometry, coordinates, 1}' AS
latitude
FROM earthquakes
ORDER BY id
LIMIT 5;
```

Listing 16-17: Extracting the earthquake's location data

The query should return five rows:

id	coordinates	longitude	latitude
	[-122.852, 38.8228333, 2.48] [-148.3859, 64.2762, 16.2]	-122.852 -148.3859	38.8228333
	[-140.3039, 04.2702, 10.2]	-152.489	59.0143

```
4 [-115.82, 32.7493333, 9.85] -115.82 32.7493333
5 [-115.6446667, 33.1711667, 5.89] -115.6446667 33.1711667
```

A quick visual compare of our result to the JSON longitude and latitude values tells us we've extracted the values properly. Next, we'll use a PostGIS function to convert those values to a Point in the geography data type.

NOTE

Your analysis database must have PostGIS enabled for this part of the chapter. If you skipped Chapter 15, you can enable PostGIS by running CREATE EXTENSION postgis; in pgAdmin.

<u>Listing 16-18</u> generates a Point of type geography for each earthquake, which we can use as input for PostGIS spatial functions.

Listing 16-18: Converting JSON location data to PostGIS geography

Inside ST_MakePoint() 1, we place our code to extract longitude and latitude, casting both values to type numeric as required by the function. We nest that function inside ST_SetSRID() to set a spatial reference system identifier (SRID) for the resulting Point. In Chapter 15, you learned that the SRID specifies a coordinate grid for plotting spatial objects. The SRID value 4326 2 denotes the commonly used WGS 84 coordinate system. Finally, we cast the entire output to the geography type. The first several rows should look like this:

earthquake_point 0101000020E61000004A0C022B87B65EC0A6C7009A52694340 0101000020E6100000D8F0F44A598C62C0EFC9C342AD115040 0101000020E6100000CFF753E3A50F63C0992A1895D4814D40 --snip--

We can't interpret those strings of digits and letters directly, but we can use pgAdmin's Geometry Viewer to see the Points plotted on a map. With your query results visible in the pgAdmin Data Output pane, click the eye icon in the <code>earthquake_point</code> result header. You should see the earthquakes plotted on a map that uses OpenStreetMap as the base layer, as in *Figure 16-1*.

Even with only a month of data, it's easy to see the abundance of earthquakes concentrated around the edges of the Pacific Ocean, in the so-called Ring of Fire where tectonic plates meet and volcanos are more active.

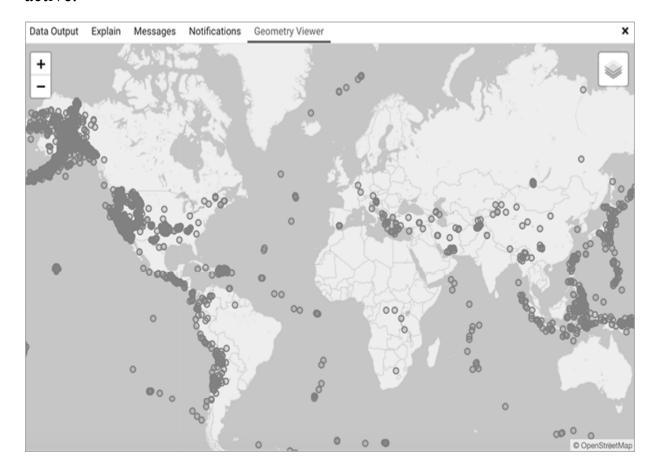


Figure 16-1: Viewing earthquake locations in pgAdmin

Finding Earthquakes Within a Distance

Next, let's narrow our study to earthquakes that occurred near Tulsa, Oklahoma—a part of the country that has seen increased seismic activity since 2009 as a result of oil and gas processing, according to the USGS.

To perform more complex GIS tasks like this, it's easier if we permanently convert the JSON coordinates to a column of PostGIS type geography in the earthquakes table. That allows us to avoid the clutter of adding conversion code in each query.

<u>Listing 16-19</u> adds a column called earthquake_point to the earthquakes table and fills the new column with the JSON coordinates converted to type geography.

Listing 16-19: Converting JSON coordinates to a PostGIS geometry column

We use ALTER TABLE 1 to add a column earthquake_point of type geography, specifying that the column will hold Points with an SRID of 4326. Next, we update 2 the table, setting the earthquake_point column using the same syntax as in <u>Listing 16-18</u>, and add a spatial index using GIST 3 to the new column.

That done, we can use <u>Listing 16-20</u> to find earthquakes within 50 miles of Tulsa.

Listing 16-20: Finding earthquakes within 50 miles of downtown Tulsa, Oklahoma

In the WHERE clause 1, we employ the ST_DWithin() function, which returns a Boolean value of true if one spatial object is within a specified distance of another object. Here, we want to evaluate each earthquake Point to check whether it's within 50 miles of downtown Tulsa. We designate the city's coordinates in ST_GeogFromText() 2 and supply the value of 50 miles using its meters equivalent, 80468, as meters is the required input. The query should return 19 rows (I've omitted the earthquake_point column and truncated the results for brevity):

place	time	magnitude
4 km SE of Owasso, Oklahoma 6 km SSE of Cushing, Oklahoma 2 km SW of Hulbert, Oklahoma snip	2021-01-04 19:46:58 2021-01-05 08:04:42 2021-01-05 21:08:28	

View the earthquake locations by clicking the eye icon atop the earthquake_point column in the results in pgAdmin. You should see 19 dots around the city, as in *Figure 16-2* (and you can adjust the underlying map style by clicking the layer icon at top right).

Achieving these results required some coding gymnastics that would have been unnecessary if the data had arrived in a shapefile or in a typical SQL table. Nevertheless, it's possible to extract meaningful insights from JSON data using PostgreSQL's support for the format. In the last part of the chapter, we'll cover useful PostgreSQL functions for generating and manipulating JSON.

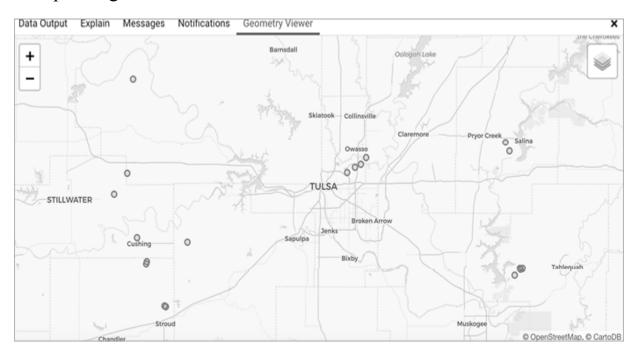


Figure 16-2: Viewing earthquakes near Tulsa, Oklahoma, in pgAdmin

Generating and Manipulating JSON

We can use PostgreSQL functions to create JSON from existing rows in a SQL table or to modify JSON stored in a table to add, subtract, or change keys and values. The PostgreSQL documentation at https://www.postgresql.org/docs/current/functions-json.html lists several dozen JSON-related functions—we'll work through a few you might find handy.

Turning Query Results into JSON

Because JSON is primarily a format for sharing data, it's useful to be able to quickly convert the results of a SQL query into JSON for delivery to

another computer system. <u>Listing 16-21</u> uses the PostgreSQL-specific to_json() function to turn rows from the employees table you made in Chapter 7 into JSON.

```
1 SELECT to_json(employees) AS json_rows
FROM employees;
```

Listing 16-21: Turning query results into JSON with to json()

The to_json() function does what it says: transforms a supplied SQL value to JSON. To convert all values in each row of the employees table, we use to_json() in a SELECT 1 and supply the table name as the function's argument; that returns each row as a JSON object with column names as keys:

We can modify our query a few ways to limit which columns to include in the results. In <u>Listing 16-22</u>, we use a row() constructor as the argument for $to_json()$.

```
SELECT to_json(row(emp_id, last_name)) 1 AS json_rows FROM employees;
```

Listing 16-22: Specifying columns to convert to JSON

A row() constructor (which is ANSI SQL compliant) builds a row value from the arguments passed to it. In this case, we supply the column names emp_id and $last_name$ 1 and place row() inside to_json (). This syntax returns just those columns in the JSON result:

Notice, however, that the keys are named f1 and f2 instead of their source column names. That's a side effect of row(), which doesn't preserve column names when it builds the row record. We can set the names of the keys, which is often done to keep the names short and reduce JSON file size, improving transfer speeds. *Listing 16-23* shows how via a subquery.

```
SELECT to_json(employees) AS json_rows
FROM (

1 SELECT emp_id, last_name AS ln2 FROM employees
) AS employees;
```

Listing 16-23: Generating key names with a subquery

We write a subquery 1 that grabs the columns we want and alias the result as employees. In the process, we alias a column name 2 to shorten its appearance as a key in the JSON.

The results should look like this:

Finally, <u>Listing 16-24</u> shows how to compile all the rows of JSON into a single array of objects. You may want to do this if you're providing this data to another application that will iterate over the array of objects to perform a task, such as a calculation, or to render data on a device.

```
1 SELECT json_agg(to_json(employees)) AS json
FROM (
```

```
SELECT emp_id, last_name AS ln FROM employees
) AS employees;
```

Listing 16-24: Aggregating the rows and converting to JSON

We wrap to_json() in the PostgreSQL-specific json_agg() 1 function, which aggregates values, including NULL, into a JSON array. Its output should look like this:

```
json

[{"emp_id":1,"ln":"Reyes"}, {"emp_id":2,"ln":"King"},
{"emp_id":3,"ln":"Pappas"}, --snip--]
```

These are simple examples, but you can build more complex JSON structures using subqueries to generate nested objects. We'll consider one way to do that as part of our "Try It Yourself" exercises at the end of the chapter.

Adding, Updating, and Deleting Keys and Values

We can add to, update, and delete from JSON with a combination of concatenation and PostgreSQL-specific functions. Let's work through some examples.

Adding or Updating a Top-Level Key/Value Pair

In <u>Listing 16-25</u>, we return to our films table and add a top-level key/value pair "studio": "Pixar" to the film *The Incredibles* using two different techniques:

```
UPDATE films
SET film = film ||1 '{"studio": "Pixar"}'::jsonb
WHERE film @> '{"title": "The Incredibles"}'::jsonb;

UPDATE films
SET film = film || jsonb_build_object('studio', 'Pixar')2
WHERE film @> '{"title": "The Incredibles"}'::jsonb;
```

Listing 16-25: Adding a top-level key/value pair via concatenation

Both examples use UPDATE statements to set new values for the jsonb column film. In the first, we use the PostgreSQL concatenation operator | | 1 to combine the existing film JSON with the new key value/pair that we cast to jsonb. In the second, we use concatenation again but with jsonb_build_object(). This function takes a series of key and value names as arguments and returns a jsonb object, letting us concatenate several key/value pairs at a time if we wanted.

Both statements will insert the new key/value pair if the key doesn't exist in the JSON being concatenated; it will overwrite a key that's present. There's no functional difference between the two statements, so feel free to use whichever you prefer. Note that this behavior is specific to jsonb, which doesn't allow duplicate key names.

If you SELECT * FROM films; and double-click the updated data in the film column, you should see the new key/value pair:

```
--snip--
    "rating": {
        "MPAA": "PG"
      },
      "studio": "Pixar",
      "characters": [
--snip--
```

Updating a Value at a Path

Currently we have two entries for the genre key for Cinema Paradiso:

```
"genre": ["romance", "drama"]
```

To add a third entry to the array, we use the function <code>jsonb_set()</code>, which allows us to specify a value to update at a specific JSON path. In *Listing*16-26, we use the <code>UPDATE</code> statement and <code>jsonb_set()</code> to add the genre <code>World War II</code>.

```
UPDATE films
SET film = jsonb_set(film, 1
```

```
'{genre}', 2
film #> '{genre}' || '["World War II"]', 3
true4)
WHERE film @> '{"title": "Cinema Paradiso"}'::jsonb;
```

Listing 16-26: Adding an array value at a path with jsonb_set()

In update, we set the value of film to the result of jsonb_set() and use where to limit the update to just the row with *Cinema Paradiso*. The function's first argument 1 is the target JSON we want to modify, here film. The second argument is the path 2 to the array value—the genre key. Third, we give the new value for genre, which we specify as the current value of genre concatenated with an array 3 with one value, "World War II". That concatenation will produce an array with three elements. The final argument is an optional Boolean value 4 that dictates whether jsonb_set() should create the value if it's not already present. It's redundant here since genre already exists; I've shown it for reference.

Run the query and then perform a quick SELECT to check the updated JSON. You should see the genre array including three values: ["romance", "drama", "World War II"].

Deleting a Value

We can remove keys and values from a JSON object by pairing two operators. <u>Listing 16-27</u> shows two UPDATE examples.

Listing 16-27: Deleting values from JSON

The minus sign 1 acts as a *deletion operator*, removing the key studio and its value, which we added earlier for *The Incredibles*. Supplying a text

string after the minus sign indicates we want to remove a key and its value; supplying an integer will remove the element at that index.

The #- 2 sign is a *path deletion operator* that removes the JSON element that exists at a path we specify. The syntax is similar to that of the path extraction operators #> and #>>. Here, we use {genre, 2} to indicate the third element of the array for genre (remember, JSON array indexes begin counting at zero). This will remove the value World War II that we added earlier to *Cinema Paradiso*.

Run both statements and then use SELECT to view the altered film JSON. You should see both elements removed.

Using JSON Processing Functions

To finish our JSON studies, we'll review a selection of PostgreSQL-specific functions for processing JSON data, including expanding array values into table rows and formatting output. You can find a complete listing of functions in the PostgreSQL documentation at https://www.postgresql.org/docs/current/functions-json.html.

Finding the Length of an Array

Counting the number of items in an array is a routine programming and analysis task. We might, for example, want to know how many actors are stored for each film in our JSON. To do this, we can use the <code>jsonb array length()</code> function in *Listing 16-28*.

Listing 16-28: Finding the length of an array

As its only argument, the function 1 takes an expression that extracts the value of the character key from film. Running the query should produce

these results:

The output correctly shows that we have three characters for *The Incredibles* and two for *Cinema Paradiso*. Note there's a similar <code>json_array_length()</code> function for the <code>json</code> type.

Returning Array Elements as Rows

The <code>jsonb_array_elements()</code> and <code>jsonb_array_elements_text()</code> functions convert array elements into rows, with one row per element. This is a useful tool for data processing. To convert JSON into structured SQL data, for example, we could use this function to generate the rows to <code>INSERT</code> into a table or to generate rows that we can aggregate by grouping and counting.

<u>Listing 16-29</u> uses both functions to turn the genre key's array values into rows. Each function takes a jsonb array as an argument. The difference between the two is that jsonb_array_elements() returns the array elements as rows of jsonb values, while jsonb_array_elements_text() returns elements as, you guessed it, text.

Listing 16-29: Returning array elements as rows

Running the code should produce these results:

```
id genre_jsonb genre_text
-- -----
1 "animation" animation
1 "action" action
```

```
1 "sci-fi" sci-fi
2 "romance" romance
2 "drama" drama
```

On an array with a simple list of values, that works nicely, but if an array contains a collection of JSON objects with their own key/value pairs, like character in our film JSON, we need additional processing to unpack the values first. <u>Listing 16-30</u> walks through the process.

Listing 16-30: Returning key values from each item in an array

We use <code>jsonb_array_elements()</code> to return the elements of the characters 1 array, which should return each JSON object in the array as a row:

```
jsonb_array_elements

1 {"name": "Mr. Incredible", "actor": "Craig T. Nelson"}
1 {"name": "Elastigirl", "actor": "Holly Hunter"}
1 {"name": "Frozone", "actor": "Samuel L. Jackson"}
2 {"name": "Salvatore", "actor": "Salvatore Cascio"}
2 {"name": "Alfredo", "actor": "Philippe Noiret"}
```

To convert the name and actor values to columns, we employ a common table expression (CTE) as covered in Chapter 13. Our CTE 2 uses <code>jsonb_array_elements()</code> to generate a simple temporary characters table

with two columns: the film's id and the unpacked array values in a column called json. We follow with a SELECT statement 3 that queries the temporary table, extracting the values of name and actor from the json column:

```
id name actor

1 Mr. Incredible Craig T. Nelson
1 Elastigirl Holly Hunter
1 Frozone Samuel L. Jackson
2 Salvatore Cascio
2 Alfredo Philippe Noiret
```

Those values are neatly parsed into a standard SQL structure and suitable for further analysis using standard SQL.

Wrapping Up

JSON is such a ubiquitous format that it's likely you'll encounter it often in your journey analyzing data. You've learned that PostgreSQL easily handles loading, indexing, and parsing JSON, but JSON sometimes requires extra steps to process that aren't needed with data handled via standard SQL conventions. As with many areas of coding, your decision on whether to make use of JSON will depend on your specific circumstances. Now, you're equipped to understand the context.

JSON itself is a standard, but the data types and the majority of functions and syntax in this chapter were PostgreSQL-specific. That's because the ANSI SQL standard leaves it to database vendors to decide how to implement most JSON support. If your work involves using Microsoft SQL Server, MySQL, SQLite, or another system, consult their documentation. You'll find many similarities in capabilities even if the function names differ.

TRY IT YOURSELF

Use your new JSON skills to answer these questions:

The earthquakes JSON has a key tsunami that's set to a value of 1 for large earthquakes in oceanic regions (though it doesn't mean a tsunami actually happened). Using either path or field extraction operators, find earthquakes with a tsunami value of 1 and include their location, time, and magnitude in your results.

Use the following CREATE TABLE statement to add the table earthquakes_from_json to your analysis database:

```
CREATE TABLE earthquakes_from_json (
   id text PRIMARY KEY,
   title text,
   type text,
   quake_date timestamp with time zone,
   mag numeric,
   place text,
   earthquake_point geography(POINT, 4326),
   url text
);
```

Using field and path extraction operators, write an INSERT statement to fill the table with the correct values for each earthquake. Refer to the full sample earthquake JSON in your *Chapter_16.sql* file for any key names and paths you need.

Bonus (difficult) question: Try writing a query to generate the following JSON using the data in the teachers and teachers lab access tables from Chapter 13:

```
"id": 6,
   "fn": "Kathleen",
   "ln": "Roush",
   "lab_access": [{
        "lab_name": "Science B",
        "access_time": "2022-12-17T16:00:00-05:00"
}, {
        "lab_name": "Science A",
        "access_time": "2022-12-07T10:02:00-05:00"
}]
}
```

It's helpful to remember that the <code>teachers</code> table has a one-to-many relationship with <code>teachers_lab_access</code>; the first three keys must come from <code>teachers</code>, and the JSON objects in the array of <code>lab_access</code> will come from <code>teachers_lab_access</code>. Hint: you'll need to use a subquery in your <code>select</code> list and a function called <code>json_agg()</code> to create the <code>lab_access</code> array. If you're stumped, take a peek in your <code>Try_It_Yourself.sql</code> file included with the book's resources, where I've placed the answers to all these exercises.

17 SAVING TIME WITH VIEWS, FUNCTIONS, AND TRIGGERS



One advantage of using a programming language is that we can automate repetitive, boring tasks. That's what this chapter is about: taking the queries or steps you might do over and over and

turning them into reusable database objects that you code once and can call later to let the database do the work. Programmers call this the DRY principle: Don't Repeat Yourself.

You'll start by learning to store queries as reusable database *views*. Next, you'll explore how to create database functions you can use to operate on your data, the same way you've used built-in functions like round() and upper(). Then you'll set up *triggers* to run your functions automatically when certain events occur on a table. All these techniques are useful not only for reducing repetitive work but for ensuring data integrity too.

We'll practice these techniques on tables created from examples in earlier chapters. All the code for this chapter is available for download along with the book's resources at https://nostarch.com/practical-sql-2nd-edition/.

Using Views to Simplify Queries

A *view* is essentially a stored query with a name that you can work with as if it were a table. For example, a view might store a query that calculates total population by state. As with a table, you could query that view, join the view to tables (or to other views), and use the view to update or insert data into a table it's based on, albeit with some caveats. The stored query in a view can be simple, referencing just one table, or complex, with multiple table joins.

Views are especially useful in the following scenarios:

Avoiding duplicate effort: They let you write a complex query once and access the results when needed.

Reducing clutter: They can trim the amount of information you need to wade through by showing only columns relevant to your needs.

Providing security: Views can limit access to only certain columns in a table.

In this section, we'll look at two kinds of views. The first—a standard view—contains PostgreSQL syntax that's largely in line with the ANSI SQL standard for views. Every time you access a standard view, the stored query runs and generates a temporary set of results. The second is a *materialized view*, which is specific to PostgreSQL, Oracle, and a limited number of other database systems. When you create a materialized view, the data returned by its query is stored permanently in the database like a table; you can refresh the view to update the stored data if needed.

NOTE

To ensure data security and prevent users from seeing sensitive information, you must restrict access by setting account permissions in PostgreSQL and also define the view using a <code>security_barrier</code> attribute. Typically, a database administrator handles these tasks, but if you want to explore this issue further, read the PostgreSQL documentation on user roles at

https://www.postgresql.org/docs/current/sql-createrole.html, on the GRANT command at https://www.postgresql.org/docs/current/sql-grant.html, and on security_barrier at https://www.postgresql.org/docs/current/rules-privileges.html.

Views are easy to create and maintain. Let's work through several examples to see how they work.

Creating and Querying Views

In this section, we'll return to the census estimates table us_counties_pop_est_2019 you imported in Chapter 5. <u>Listing 17-1</u> creates a standard view that returns just the population of Nevada counties. The original table has sixteen columns; the view will return just four of them. This would be useful for making a subset of Nevada census data quickly accessible when we're referring to it often or using the data in an application.

Listing 17-1: Creating a view that displays Nevada 2019 counties

We define the view using the keywords CREATE OR REPLACE VIEW 1 followed by the view's name, nevada_counties_pop_2019, and then As.

(We can name the view any way we'd like; I prefer a name that's descriptive of the view's results.) Next, we use a standard SQL SELECT 2 to fetch the 2019 population estimate (the pop_est_2019 column) for each Nevada county from the us_counties_pop_est_2019 table.

Notice the OR REPLACE keywords after CREATE. These are optional and tell the database that if a view with this name already exists, then replace it with the new definition. It's helpful to include these keywords if you're iterating on creating a view and want to refine the query. There is one caveat: if you're replacing an existing view, the new query 2 must generate the same column names with the same data types and in the same order as the one it's replacing. You can add columns, but they must be placed at the end of the column list. If you try to do otherwise, the database will respond with an error message.

Run the code in <u>Listing 17-1</u> using pgAdmin. The database should respond with the message CREATE VIEW. To find the new view, in pgAdmin's object browser, right-click the analysis database and click **Refresh**. Choose **Schemas**public Views to see all views. When you right-click your new view and click **Properties**, you should see a more verbose version of the query (with the table name prepended to each column name) on the Code tab in the dialog that opens. That's a handy way to inspect views you might find in a database.

NOTE

As with other database objects, you can delete a view using the DROP command. In this example, the syntax would be DROP VIEW nevada_counties_pop_2019;.

This type of view—one that isn't materialized—holds no data at this point; instead, the stored SELECT query it contains will run when you access the view from another query. For example, the code in <u>Listing 17-2</u> returns all columns in the view. As with a typical SELECT query, we can use ORDER BY to sort results, this time using the county's Federal Information Processing Standards (FIPS) code—the standard designator the US Census

Bureau and other federal agencies use to specify each county and state. We also add a LIMIT clause to display just five rows.

```
SELECT *
FROM nevada_counties_pop_2019
ORDER BY county_fips
LIMIT 5;
```

Listing 17-2: Querying the nevada_counties_pop_2010 view

Aside from the five-row limit, the result should be the same as if you had run the SELECT query used to create the view in *Listing 17-1*:

geo_name		state_fips	 +-	county_fips		pop_2010
Churchill County	i	32		001		24909
Clark County		32		003		2266715
Douglas County		32		005		48905
Elko County		32		007		52778
Esmeralda County		32		009		873

This simple example isn't useful unless quickly listing Nevada county population is a task you'll perform frequently. So, let's imagine a question data-minded analysts in a political research organization might ask often: what was the percent change in population for each county in Nevada (or any other state) from 2010 to 2019?

We wrote a query to answer this question in Chapter 7, and though it wasn't onerous to create, it did require joining tables on two columns and using a percent change formula that involved rounding and type casting. To avoid repeating that work, we can create a view that stores a query similar to the one in Chapter 7 as a view, as shown in <u>Listing 17-3</u>.

Listing 17-3: Creating a view showing population change for US counties

We start the view definition with CREATE OR REPLACE VIEW 1, followed by the name of the view and As. The SELECT query 2 names columns from the census tables and includes a column definition with a percent change calculation 3 that you learned about in Chapter 6. Then we join the 2019 and 2010 census tables 4 using the state and county FIPS codes. Run the code, and the database should again respond with CREATE VIEW.

Now that we've created the view, we can use the code in <u>Listing 17-4</u> to run a simple query using the new view that retrieves data for Nevada counties.

```
SELECT county_name,
state_name,
pop_2019,

1 pct_change_2019_2010
FROM county_pop_change_2019_2010

2 WHERE state_name = 'Nevada'
ORDER BY county_fips
LIMIT 5;
```

Listing 17-4: Selecting columns from the county_pop_change_2019_2010 view

In <u>Listing 17-2</u>, in the query that referenced our nevada_counties_pop_2019 view, we retrieved every column in the view by using the asterisk wildcard after SELECT. <u>Listing 17-4</u> shows that, as with a query on a table, we can name specific columns when querying a view. Here, we specify four of the county_pop_change_2019_2010 view's seven columns. One is pct_change_2019_2010 1, which returns the result of the

percent change calculation we're looking for. As you can see, it's much simpler to write the column name like this than the whole formula. We're also filtering the results using a WHERE clause 2, similar to how we'd filter any query.

After querying the four columns from the view, the results should look like this:

county_name	state_name	pop_2019	pct_change_2019_2010
Churchill County	Nevada	24909	0.1
Clark County	Nevada	2266715	16.2
Douglas County	Nevada	48905	4.1
Elko County	Nevada	52778	7.8
Esmeralda County	Nevada	873	11.4

Now we can revisit this view as often as we like to pull data for presentations or to answer questions about the percent change in population for any county in America from 2010 to 2019.

Looking at just these five rows, you can see a couple of interesting stories emerge: the continued rapid growth of Clark County, which includes the city of Las Vegas, as well as a strong percent increase in Esmeralda County, one of the smallest counties in the United States and home to several ghost towns.

Creating and Refreshing a Materialized View

A materialized view differs from a standard view in that upon its creation, the materialized view's stored query is executed, and the results it generates are saved in the database. In effect, this creates a new table. The view retains its stored query, so you can update the saved data by issuing a command to refresh the view. A good use for materialized views is to preprocess complex queries that take a while to run and make those results available for faster querying.

Let's drop the nevada_counties_pop_2019 view and re-create it as a materialized view using the code in <u>Listing 17-5</u>.

Listing 17-5: Creating a materialized view

First, we use a DROP VIEW 1 statement to remove the nevada_counties_pop_2019 view from the database. Then, we run CREATE MATERIALIZED VIEW 2 to make the view. Notice that the syntax is the same as the one for making a standard view, except for the added MATERIALIZED keyword and the omission of OR REPLACE, which is not available in the materialized view syntax. After running the statement, the database should respond with the message SELECT 17, telling you that the view's query produced 17 rows to be stored in the view. We can now query this data as with a standard view.

Let's say that the population estimates stored in us_counties_pop_est_2019 are revised. To update the data stored in the materialized view, we can use the REFRESH keyword, as in <u>Listing 17-6</u>.

```
REFRESH MATERIALIZED VIEW nevada_counties_pop_2019;
```

Listing 17-6: Refreshing a materialized view

Executing this statement reruns the query stored in the nevada_counties_pop_2019 view; the server will respond with the message REFRESH MATERIALIZED VIEW. The view will now reflect any updates to the data referenced by the view's query. When you have a query that takes some time to run, you can save time by storing its results in a materialized view that's refreshed periodically, letting users quickly access the stored data rather than run a lengthy query.

NOTE

Using Refresh materialized view concurrently will prevent locking out select statements that are executed against the view during the refresh. See https://www.postgresql.org/docs/current/sql-refreshmaterializedview.html for details.

To delete a materialized view, we use a DROP MATERIALIZED VIEW statement. Also, note that materialized views appear in a different part of pgAdmin's object browser, under Schemas public Materialized Views.

Inserting, Updating, and Deleting Data Using a View

With nonmaterialized views, you can update or insert data in the underlying table being queried as long as the view meets certain conditions. One requirement is that the view must reference a single table or updatable view. If the view's query joins tables, as with the population change view we just built in the previous section, you can't perform inserts or updates to the original table directly. Also, the view's query can't contain DISTINCT, WITH, GROUP BY, or other clauses. (See a complete list of restrictions at https://www.postgresql.org/docs/current/sql-createview.html.)

You already know how to directly insert and update data on a table, so why do it through a view? One reason is that a view is one way you can exercise control over which data a user can update. Let's work through an example to see how this works.

Creating a View of Employees

In the Chapter 7 lesson on joins, we created and filled the departments and employees tables with four rows about people and where they work (if you skipped that section, you can revisit <u>Listing 7-1</u>). Running a quick SELECT * FROM employees ORDER BY emp_id; query shows the table's contents, as you can see here:

```
emp_id first_name last_name salary dept_id
----- 1 Julia Reyes 115300.00 1
```

2 Janet	King	98000.00	1
3 Arthur	Pappas	72700.00	2
4 Michael	Taylor	89500.00	2

Let's say we want to use a view to give users in the Tax Department (its dept_id is 1) the ability to add, remove, or update their employees' names without letting them change salary information or the data of employees in another department. To do this, we can set up a view using <u>Listing 17-7</u>.

```
CREATE OR REPLACE VIEW employees_tax_dept WITH

(security_barrier) 1 AS

SELECT emp_id,
first_name,
last_name,
dept_id
FROM employees

2 WHERE dept_id = 1
3 WITH LOCAL CHECK OPTION;
```

Listing 17-7: Creating a view on the employees table

someone might subvert a view if you omit this type of security.)

changing an employee's dept id to a value other than 1.

This view is similar to others we've created so far, but with a few additions. First, in the CREATE OR REPLACE VIEW statement, we add the keywords WITH (security_barrier) 1. This enables a level of database security to prevent a malicious user from getting around restrictions that the view places on rows and columns. (See https://www.postgresgl.org/docs/current/rules-privileges.html for how

In the view's select query, we pick the columns we want to show from the employees table and use where to filter the results on dept_id = 12 to list only Tax Department staff. The view itself will restrict updates or deletes to rows matching the condition in the where clause. Adding the keywords with local check option 3 restricts inserts as well, allowing users to add new Tax Department employees only (if the view definition omitted those keywords, you could use it to insert a row with a dept_id of 3, for example). The local check option also prevents a user from

Create the employees_tax_dept view by running the code in <u>Listing 17-</u>
7. Then run SELECT * FROM employees_tax_dept ORDER BY emp_id;, which should provide these two rows:

```
emp_id first_name last_name dept_id

1 Julia Reyes 1
2 Janet King 1
```

The result shows the employees who work in the Tax Department; they're two of the four rows in the entire employees table.

Now, let's look at how inserts and updates work via this view.

Inserting Rows Using the employees_tax_dept View

We can use a view to insert or update data, but instead of using the table name in the INSERT or update statement, we substitute the view name. After we add or change data using a view, the change is applied to the underlying table, which in this case is employees. The view then reflects the change via the query it runs.

<u>Listing 17-8</u> shows two examples that attempt to add new employee records via the employees_tax_dept view. The first succeeds, but the second fails.

Listing 17-8: Successful and rejected inserts via the employees tax dept view

In the first INSERT 1, which uses the insert syntax you learned in Chapter 2, we supply the first and last names of Suzanne Legere plus her <code>emp_id</code> and <code>dept_id</code>. Because the new row will satisfy the <code>LOCAL CHECK</code> in the view —it contains the same columns and <code>dept_id</code> is 1—the insert succeeds when it executes.

But when we run the second INSERT 2 to add an employee named Jamil White using a dept_id of 2, the operation fails with the error message new row violates check option for view "employees_tax_dept". The reason is that when we created the view, we used a where clause to return only rows with dept_id = 1. The dept_id of 2 doesn't pass the LOCAL CHECK, so it's prevented from being inserted.

Run the SELECT statement 3 on the view to check that Suzanne Legere was successfully added:

<u> </u>	IIISt_name	last_name	dept_id
1 (Julia	Reyes	1
2	Janet	King	1
5 \$	Suzanne	Legere	1

We also query the employees table 4 to see that, in fact, Suzanne Legere was added to the full table. The view queries the employees table each time we access it.

emp_id	first_name	last_name	salary	dept_id
1	Julia	Reyes	115300.00	1
2	Janet	King	98000.00	1
3	Arthur	Pappas	72700.00	2
4	Michael	Taylor	89500.00	2
5	Suzanne	Legere		1

As you can see from the addition of Suzanne Legere, the data we add using a view is also added to the underlying table. However, because the view doesn't include the salary column, the value in her row is NULL. If you attempt to insert a salary value using this view, you would receive the error message column "salary" of relation "employees_tax_dept" does not exist. The reason is that even though the salary column exists in the underlying employees table, it's not referenced in the view. Again,

this is one way to limit access to sensitive data. Check the links I provided in the note in the section "Using Views to Simplify Queries" to learn more about granting permissions to users and adding WITH (security_barrier) if you plan to take on database administrator responsibilities.

Updating Rows Using the employees tax dept View

The same restrictions on accessing data in an underlying table apply when we update data using the <code>employees_tax_dept</code> view. <u>Listing 17-9</u> shows a standard query to change the spelling of Suzanne's last name using <code>update</code> (as a person with more than one uppercase letter in their last name, I can confirm such corrections aren't unusual).

```
UPDATE employees_tax_dept
SET last_name = 'Le Gere'
WHERE emp_id = 5;

SELECT * FROM employees_tax_dept ORDER BY emp_id;
```

Listing 17-9: Updating a row via the employees_tax_dept view

Run the code, and the result from the SELECT query should show the updated last name, which occurs in the underlying employees table:

```
emp_id first_name last_name dept_id

1 Julia Reyes 1
2 Janet King 1
5 Suzanne Le Gere 1
```

Suzanne's last name is now correctly spelled as Le Gere, not Legere.

However, if we try to update the name of an employee who's not in the Tax Department, the query fails just as it did when we tried to insert Jamil White in <u>Listing 17-8</u>. Trying to use this view to update the salary of an employee—even one in the Tax Department—will also fail. If the view doesn't reference a column in the underlying table, you can't access that column through the view. Again, the fact that updates on views are restricted in this way offers ways to secure and hide certain pieces of data.

Deleting Rows Using the employees_tax_dept View

Now, let's explore how to delete rows using a view. The restrictions on which data you can affect apply here as well. For example, if Suzanne Le Gere gets a better offer from another firm and decides to leave, you could remove her from <code>employees</code> through the <code>employees_tax_dept</code> view. *Listing* 17-10 shows the query in the standard <code>DELETE</code> syntax.

```
DELETE FROM employees_tax_dept
WHERE emp_id = 5;
```

Listing 17-10: Deleting a row via the employees tax dept view

Run the query, and PostgreSQL should respond with DELETE 1. However, when you try to delete a row for an employee in a department other than the Tax Department, PostgreSQL won't allow it and will report DELETE 0.

In summary, views not only give you control over access to data, but also give you shortcuts for working with data. Next, let's explore how to use functions to save keystrokes and time.

Creating Your Own Functions and Procedures

You've used functions throughout the book, such as to capitalize letters with <code>upper()</code> or add numbers with <code>sum()</code>. Behind these functions is a significant amount of (sometimes complex) programming that executes a series of actions and may, depending on the job of the function, return a response. We'll avoid complicated code here, but we'll build some basic functions that you can use as a launchpad for your own ideas. Even simple functions can help you avoid repeating code.

Much of the syntax in this section is specific to PostgreSQL, which supports both user-defined functions and *procedures* (the difference between the two is subtle, and I'll give examples of both). You can define functions and procedures using plain SQL, but you also can choose from other options. One is a PostgreSQL-specific *procedural language* called PL/pgSQL that adds features not found in standard SQL, such as logical

control structures (IF ... THEN ... ELSE). Other options include PL/Python and PL/R for the Python and R programming languages.

Note that major database systems including Microsoft SQL Server, Oracle, and MySQL implement their own variations of functions and procedures. If you're using another database management system, this section will be useful for understanding concepts related to functions, but you'll need to check your database's documentation for specifics on its implementation of functions.

Creating the percent_change() Function

A function processes data and returns a value. As an example, let's write a function to simplify a staple of data analysis: calculating the percent change between two values. In Chapter 6, you learned that we express the percent change formula this way:

```
percent change = (New Number - Old Number) / Old Number
```

Rather than writing that formula each time we need it, we can create a function called percent_change() that takes the new and old numbers as inputs and returns the result rounded to a user-specified number of decimal places. Let's walk through the code in <u>Listing 17-11</u> to see how to declare a simple function that uses SQL.

Listing 17-11: Creating a percent_change() function

A lot is happening in this code, but it's not as complicated as it looks. We start with the command CREATE OR REPLACE FUNCTION 1. As with the syntax to create a view, the OR REPLACE keywords are optional. We then give the name of the function 2 and, in parentheses, a list of *arguments* that determine the function's inputs. Each argument will serve as an input to the function and gets a name and data type. For example, new_value and old_value are numeric and require that the user of the function supply input values matching that type, whereas decimal_places (which specifies the number of places to round results) is integer. For decimal_places, we specify 1 as the DEFAULT 3 value—this makes the argument optional and, if it's omitted by the user, will set the argument to 1 by default.

We then use the keywords RETURNS numeric AS 4 to tell the function to return its calculation as type numeric. If this were a function to concatenate strings, we might return text.

Next, we write the meat of the function that performs the calculation. Inside single quotes, we place a SELECT query 5 that includes the percent change calculation nested inside a round() function. In the formula, we use the function's argument names instead of numbers.

We then supply a series of keywords that define the function's attributes and behavior. The Language 6 keyword specifies that we've written this function using plain SQL as opposed to one of other languages PostgreSQL supports for creating functions. Next, the IMMUTABLE keyword 7 indicates that the function cannot modify the database and will always return the same result for a given set of arguments. The line RETURNS NULL ON NULL INPUT 8 guarantees that the function will supply a NULL response if any input that is not supplied by default is a NULL.

Run the code using pgAdmin to create the percent_change() function. The server should respond with the message CREATE FUNCTION.

Using the percent change() Function

To test the new percent_change() function, run it by itself using SELECT, as shown in <u>Listing 17-12</u>.

```
SELECT percent_change(110, 108, 2);
```

Listing 17-12: Testing the percent_change() function

This example uses a value of 110 for the new number, 108 for the old number, and 2 as the desired number of decimal places to round the result.

Run the code; the result should look like this:

The result tells us there's a 1.85 percent increase between 108 and 110. Experiment with other numbers to see how the results change. Also, try changing the decimal_places argument to values including 0, or omit it, to see how that affects the output. You should see results that have more or fewer numbers after the decimal point, based on your input.

We created this function to avoid writing the full percent change formula in queries. Let's use it to calculate percent change using a version of the census estimates population change query we wrote in Chapter 7, as shown in *Listing* 17-13.

```
SELECT c2019.county name,
       c2019.state name,
       c2019.pop est 2019 AS pop 2019,
     1 percent change (c2019.pop est 2019,
                      c2010.estimates base 2010) AS
pct chg func,
     2 round( (c2019.pop est 2019::numeric -
c2010.estimates base 2010)
           / c2010.estimates base 2010 * 100, 1 ) AS
pct change formula
FROM us counties pop est 2019 AS c2019
    JOIN us counties pop est 2010 AS c2010
ON c2019.state fips = c2010.state fips
   AND c2019.county fips = c2010.county fips
ORDER BY pct chg func DESC
LIMIT 5;
```

Listing 17-13: Testing percent change () on census data

<u>Listing 17-13</u> modifies the original query from Chapter 7 to add the percent_change() function 1 as a column in SELECT. We also include the explicit percent change formula 2 so we can compare results. As inputs, we use the 2019 population estimate column (c2019.pop_est_2019) as the new number and the 2010 estimates base as the old (c2010.estimates base 2010).

The query results should display the five counties with the greatest percent change in population, and the results from the function should match the results from the formula entered directly into the query. Note that each value in the pct_chg_func column has one decimal place, the function's default value, because we didn't provide the optional third argument. Here's the result with both the function and the formula:

county_name pct_chg_formula	state_name	pop_2019	pct_chg_func	
McKenzie County 136.3	North Dakota	15024	136.3	
Loving County 106.1	Texas	169	106.1	
Williams County 67.8	North Dakota	37589	67.8	
Hays County 46.5	Texas	230191	46.5	
Wasatch County 44.9	Utah	34091	44.9	

Now that we know the function works as intended, we can use percent_change() any time we need to solve that calculation—and that's much faster than writing out the formula!

Updating Data with a Procedure

As implemented in PostgreSQL, a *procedure* is a close relative of a function, albeit with some significant differences. Both procedures and functions can perform data operations that don't return a value, such as an update. Procedures, on the other hand, don't have a clause to return a value, while functions do. Also, procedures can incorporate the transaction commands we covered in Chapter 10 such as COMMIT and ROLLBACK, and

functions cannot. Many database managers implement procedures, which are sometimes referred to as *stored procedures*. PostgreSQL added procedures as of version 11 and are part of the SQL standard, though PostgreSQL syntax is not fully compatible.

We can simplify routine updates to data using procedures. In this section, we'll write a procedure that updates a record of the correct number of personal days off a teacher gets (in addition to vacation days) based on the time elapsed since their hire date.

For this exercise, we'll return to the teachers table from the first lesson in Chapter 2. If you skipped "Creating a Table" in that chapter, create the teachers table and insert the data now using the example code in Listings 2-2 and 2-3.

Let's add a column to teachers to hold the teachers' personal days using the code in <u>Listing 17-14</u>. The new column will be empty until we fill it later using a procedure.

```
ALTER TABLE teachers ADD COLUMN personal_days integer;

SELECT first_name,
    last_name,
    hire_date,
    personal_days

FROM teachers;
```

Listing 17-14: Adding a column to the teachers table and seeing the data

<u>Listing 17-14</u> updates the teachers table using ALTER and adds the personal_days column using the keywords ADD COLUMN. We then run the SELECT statement to view the data, in which we also include the names and hire dates of each teacher. When both queries finish, you should see the following six rows:

first_name	last_name	hire_date	personal_days
Janet	Smith	2011-10-30	
Lee	Reynolds	1993-05-22	
Samuel	Cole	2005-08-01	
Samantha	Bush	2011-10-30	

Betty	Diaz	2005-08-30
Kathleen	Roush	2010-10-22

The personal_days column contains only NULL values because we haven't inserted anything yet.

Now, let's create a procedure called update_personal_days() that populates the personal_days column with their earned personal days (in addition to vacation days). We'll use the following criteria:

Less than 10 years since hire: 3 personal days

10 to less than 15 years since hire: 4 personal days

15 to less than 20 years since hire: 5 personal days

20 years to less than 25 years since hire: 6 personal days

25 years or more since hire: 7 personal days

The code in <u>Listing 17-15</u> creates a procedure. This time, instead of using plain SQL, we'll incorporate elements of the PL/pgSQL procedural language, which is an additional language PostgreSQL supports for writing functions. Let's walk through some differences.

```
CREATE OR REPLACE PROCEDURE update personal days()
  AS 1$$
2 BEGIN
       UPDATE teachers
       SET personal days =
         3 CASE WHEN (now() - hire date) >= '10 years'::interval
                     AND (now() - hire date) < '15
   years'::interval THEN 4
                WHEN (now() - hire date) >= '15 years'::interval
                     AND (now() - hire date) < '20
   years'::interval THEN 5
                WHEN (now() - hire date) >= '20 years'::interval
                    AND (now() - hire date) < '25
   years'::interval THEN 6
                WHEN (now() - hire date) >= '25 years'::interval
   THEN 7
                ELSE 3
           END;
     4 RAISE NOTICE 'personal days updated!';
   END;
```

Listing 17-15: Creating an update_personal_days() function

We begin with CREATE OR REPLACE PROCEDURE and give the procedure a name. This time, we provide no arguments because no user input is required—the procedure operates on predetermined columns with set values for calculating intervals.

Often, when writing PL/pgSQL-based functions, the PostgreSQL convention is to use the non-ANSI SQL standard dollar-quote (\$\$) to mark the start 1 and end 5 of the string that contains all the function's commands. (As with the percent_change() SQL function earlier, you could use single quote marks to enclose the string, but then any single quotes in the string would need to be doubled, and that not only looks messy but can be confusing.) So, everything between the pair of \$\$ is the code that does the work. You can also add some text between the dollar signs, like \$namestring\$, to create a unique pair of beginning and ending quotes. This is useful, for example, if you need to quote a query inside the function.

Right after the first \$\$ we start a BEGIN ... END; 2 block. This is a PL/pgSQL convention that delineates the start and end of a section of code within a function or procedure; as with dollar quotes, it is possible to nest one BEGIN ... END; inside another to facilitate logical groupings of code. Inside that block, we place an UPDATE statement that uses a CASE statement 3 to determine the number of days each teacher gets. We subtract the hire_date from the current date, which is retrieved from the server by the now() function. Depending on which range now() - hire_date falls into, the CASE statement returns the number of personal days corresponding to the range. We use the PL/pgSQL keywords RAISE NOTICE 4 to display a message that the procedure is done. Finally, we use the LANGUAGE keyword 6 so the database knows to interpret what we've written according to the syntax specific to PL/pgSQL.

Run the code in <u>Listing 17-15</u> to create the update_personal_days() procedure. To invoke the procedure, we use the CALL command, which is part of the ANSI SQL standard:

```
CALL update_personal_days();
```

When the procedure runs, the server responds with the notice it raises, which is personal days updated!.

When you rerun the SELECT statement in <u>Listing 17-14</u>, you should see that each row of the personal_days column is filled with the appropriate values. Note that results will vary depending on when you run this function, because calculations using now() change as time passes.

first_name	last_name	hire_date	personal_days
Janet	Smith	2011-10-30	3
Lee	Reynolds	1993-05-22	7
Samuel	Cole	2005-08-01	5
Samantha	Bush	2011-10-30	3
Betty	Diaz	2005-08-30	5
Kathleen	Roush	2010-10-22	4

You could use the <code>update_personal_days()</code> function to regularly update data manually after performing certain tasks, or you could use a task scheduler such as pgAgent (a separate open source tool) to run it automatically. You can learn about pgAgent and other tools in "PostgreSQL Utilities, Tools, and Extensions" in the appendix.

Using the Python Language in a Function

Previously, I mentioned that PL/pgSQL is the default procedural language within PostgreSQL, but the database also supports creating functions using open source languages, such as Python and R. This support allows you to take advantage of features and modules from those languages within functions you create. For example, with Python, you can use the pandas library for analysis. The documentation at https://www.nostgresql.org/docs/current/server-programming.html provides

<u>https://www.postgresql.org/docs/current/server-programming.html</u> provides a comprehensive review of the languages included with PostgreSQL, but here I'll show you a simple function using Python.

To enable PL/Python, you must create the extension using the code in *Listing 17-16*.

Listing 17-16: Enabling the PL/Python procedural language

If you get an error, such as image not found, that means the PL/Python extension is not installed on your system. Depending on the operating system, installation of PL/Python typically requires installation of Python and additional configuration beyond the basic PostgreSQL install. For this, refer to the installation instructions for your operating system in Chapter 1.

After enabling the extension, we can create a function using syntax similar to the examples you've tried so far, but using Python for the body of the function. <u>Listing 17-17</u> shows how to use PL/Python to create a function called <code>trim_county()</code> that removes the word *County* from the end of a string. We'll use this function to clean up names of counties in the census data.

```
CREATE OR REPLACE FUNCTION trim_county(input_string text)

1 RETURNS text AS $$
    import re2
3 cleaned = re.sub(r' County', '', input_string)
    return cleaned
    $$
4 LANGUAGE plpython3u;
```

Listing 17-17: Using PL/Python to create the trim county() function

The structure should look familiar. After naming the function and its text input, we use the RETURNS keyword 1 to specify that the function will send text back. After the opening \$\$ quotes, we get straight to the Python code, starting with a statement to import the Python regular expressions module, re 2. Even if you don't know much about Python, you can probably deduce that the next two lines of code 3 set a variable called cleaned to the results of a Python regular expression function called sub(). That function looks for a space followed by the word *County* in the input_string passed into the function and substitutes an empty string, which is denoted by two apostrophes. Then the function returns the content of the variable cleaned.

To end, we specify Language plpython3u 4 to note we're writing the function with PL/Python.

Run the code to create the function, and then execute the SELECT statement in *Listing 17-18* to see it in action.

```
SELECT county_name,
	trim_county(county_name)
FROM us_counties_pop_est_2019
ORDER BY state_fips, county_fips
LIMIT 5;
```

Listing 17-18: Testing the trim county() function

We use the county_name column in the us_counties_pop_est_2019 table as input to trim county(). That should return these results:

```
county_name trim_county

Autauga County Autauga
Baldwin County Baldwin
Barbour County Barbour
Bibb County Bibb
Blount County Blount
```

As you can see, the <code>trim_county()</code> function evaluated each value in the <code>county_name</code> column and removed a space and the word *County* when present. Although this is a trivial example, it shows how easy it is to use Python—or one of the other supported procedural languages—inside a function.

Next, you'll learn how to use triggers to automate your database.

Automating Database Actions with Triggers

A database *trigger* executes a function whenever a specified event, such as an INSERT, UPDATE, or DELETE, occurs on a table or a view. You can set a trigger to fire before, after, or instead of the event, and you can also set it to fire once for each row affected by the event or just once per operation. For

example, let's say you delete 20 rows from a table. You could set the trigger to fire once for each of the 20 rows deleted or just one time.

We'll work through two examples. The first example keeps a log of changes made to grades at a school. The second automatically classifies temperatures each time we collect a reading.

Logging Grade Updates to a Table

Let's say we want to automatically track changes made to a student grades table in our school's database. Every time a row is updated, we want to record the old and new grade plus the time the change occurred (search online for *David Lightman and grades* and you'll see why this might be worth tracking). To handle this task automatically, we'll need three items:

A grades_history table to record the changes to grades in a grades table

A trigger to run a function every time a change occurs in the grades table, which we'll name grades update

The function the trigger will execute, which we'll call record if grade changed()

Creating Tables to Track Grades and Updates

Let's start by making the tables we need. <u>Listing 17-19</u> includes the code to first create and fill grades and then create grades history.

```
3 CREATE TABLE grades_history (
          student_id bigint NOT NULL,
          course_id bigint NOT NULL,
          change_time timestamp with time zone NOT NULL,
          course text NOT NULL,
          old_grade text NOT NULL,
          new_grade text NOT NULL,
          PRIMARY KEY (student_id, course_id, change_time)
);
```

Listing 17-19: Creating the grades and grades history tables

These commands are straightforward. We use CREATE to make a grades table 1 and add four rows using INSERT 2, where each row represents a student's grade in a class. Then we use CREATE TABLE to make the grades_history table 3 to hold the data we log each time an existing grade is altered. The grades_history table has columns for the new grade, old grade, and the time of the change. Run the code to create the tables and fill the grades table. We insert no data into grades_history here because the trigger process will handle that task.

Creating the Function and Trigger

Next, let's write the record_if_grade_changed() function that the trigger will execute (note that the PostgreSQL documentation refers to such functions as *trigger procedures*). We must write the function before naming it in the trigger. Let's go through the code in <u>Listing 17-20</u>.

```
CREATE OR REPLACE FUNCTION record_if_grade_changed()
   1 RETURNS trigger AS
$$
BEGIN
   2 IF NEW.grade <> OLD.grade THEN
   INSERT INTO grades_history (
        student_id,
        course_id,
        change_time,
        course,
        old_grade,
        new_grade)
   VALUES
        (OLD.student_id,
```

```
OLD.course_id,
    now(),
    OLD.course,

3 OLD.grade,
    4 NEW.grade);
    END IF;

5 RETURN NULL;
END;
$$ LANGUAGE plpgsql;
```

Listing 17-20: Creating the record_if_grade_changed() function

The record_if_grade_changed() function follows the pattern of earlier examples but with differences specific to working with triggers. First, we specify RETURNS trigger 1 instead of a data type. We use dollar-quotes to delineate the code portion of the function, and because record_if_grade_changed() is a PL/pgSQL function, we also place the code to execute inside a BEGIN ... END; block. Next, we start the procedure using an IF ... THEN statement 2, which is one of the control structures PL/pgSQL provides. We use it here to run the INSERT statement only if the updated grade is different from the old grade, which we check using the <> operator.

When a change occurs to the <code>grades</code> table, the trigger (which we'll create next) will execute. For each row that's changed, the trigger will pass two collections of data into <code>record_if_grade_changed()</code>. The first is the row values before they were changed, noted with the prefix <code>OLD</code>. The second is the row values after they were changed, noted with the prefix <code>NEW</code>. The function can access the original row values and the updated row values, which it will use for a comparison. If the <code>IF...</code> Then statement evaluates as <code>true</code>, indicating that the old and new <code>grade</code> values are different, we use <code>INSERT</code> to add a row to <code>grades_history</code> that contains both <code>OLD.grade 3</code> and <code>NEW.grade 4</code>. Finally, we include a <code>RETURN</code> statement 5 with a value of <code>NULL</code>; the trigger procedure performs a database <code>INSERT</code>, so we do not need a value returned.

NOTE

Sometimes a RETURN value is ignored; the PostgreSQL documentation at https://www.postgresql.org/docs/current/plpgsql-trigger.html details the scenarios in which this occurs.

Run the code in <u>Listing 17-20</u> to create the function. Then, add the grades_update trigger to the grades table using <u>Listing 17-21</u>.

```
1 CREATE TRIGGER grades_update
2 AFTER UPDATE
   ON grades
3 FOR EACH ROW
4 EXECUTE PROCEDURE record_if_grade_changed();
```

Listing 17-21: Creating the grades_update trigger

In PostgreSQL, the syntax for creating a trigger follows the ANSI SQL standard (although not all aspects of the standard are supported, per the documentation at https://www.postgresql.org/docs/current/sql-createtrigger.html). The code begins with a CREATE TRIGGER 1 statement, followed by clauses that control when the trigger runs and how it behaves. We use AFTER UPDATE 2 to specify that we want the trigger to fire after the update occurs on the grades row. We could also use the BEFORE OF INSTEAD OF keywords depending on the need.

We write FOR EACH ROW 3 to tell the trigger to execute the procedure once for each row updated in the table. For example, if someone runs an update that affects three rows, the procedure will run three times. The alternate (and default) is FOR EACH STATEMENT, which runs the procedure once. If we didn't care about capturing changes to each row and simply wanted to record that grades were changed at a certain time, we could use that option. Finally, we use EXECUTE PROCEDURE 4 to name record_if_grade_changed() as the function the trigger should run.

Create the trigger by running the code in <u>Listing 17-21</u> in pgAdmin. The database should respond with the message CREATE TRIGGER.

Testing the Trigger

Now that we've created the trigger and the function, it should run when data in the grades table changes; let's see what the process does. First, let's check the current status of our data. When you run <code>SELECT * FROM grades_history;</code>, you'll see that the table is empty because we haven't made any changes to the <code>grades</code> table yet and there's nothing to track. Next, when you run <code>SELECT * FROM grades ORDER BY student_id</code>, <code>course_id;</code>, you should see the grade data that you inserted in <code>Listing 17-19</code>, as shown here:

```
        student_id
        course_id
        course
        grade

        1
        1
        Biology 2
        F

        1
        2
        English 11B
        D

        1
        3
        World History 11B
        C

        1
        4
        Trig 2
        B
```

That Biology 2 grade doesn't look very good. Let's update it using the code in *Listing* 17-22.

```
UPDATE grades
SET grade = 'C'
WHERE student_id = 1 AND course_id = 1;
```

Listing 17-22: Testing the grades update trigger

When you run the UPDATE, pgAdmin doesn't display anything to let you know that the trigger executed in the background. It just reports UPDATE 1, meaning a row was updated. But our trigger did run, which we can confirm by examining columns in grades_history using this SELECT query:

When you run this query, you should see that the grades_history table, which contains all changes to grades, now has one row:

```
student_id change_time course
old_grade new_grade
------
1 2023-09-01 15:50:43.291164-04 Biology 2 F
C
```

This row displays the old Biology 2 grade of F, the new value C, and change_time, showing the time of update (your result should reflect your date and time). Note that the addition of this row to grades_history happened in the background without the knowledge of the person making the update. But the update event on the table caused the trigger to fire, which executed the record_if_grade_changed() function.

If you've ever used a content management system, such as WordPress or Drupal, this sort of revision tracking might be familiar. It provides a helpful record of changes made to content for reference, auditing, and, unfortunately, occasional finger-pointing. Regardless, the ability to trigger actions on a database automatically gives you more control over your data.

Automatically Classifying Temperatures

In Chapter 13, we used the SQL CASE statement to reclassify temperature readings into descriptive categories. The CASE statement is also part of the PL/pgSQL procedural language, and we can use its capability to assign values to variables to automatically store those category names in a table each time we add a temperature reading. If we're routinely collecting temperature readings, using this technique to automate the classification spares us from having to handle the task manually.

We'll follow the same steps we used for logging the grade changes: we first create a function to classify the temperatures and then create a trigger to run the function each time the table is updated. Use <u>Listing 17-23</u> to create a temperature test table for the exercise.

```
CREATE TABLE temperature_test (
    station_name text,
    observation_date date,
    max_temp integer,
    min_temp integer,
    max temp group text,
```

```
PRIMARY KEY (station_name, observation_date)
);
```

Listing 17-23: Creating a temperature test table

The temperature_test table contains columns to hold the name of the station and date of the temperature observation. Let's imagine that we have some process to insert a row once a day that provides the maximum and minimum temperature for that location, and we need to fill the max_temp_group column with a descriptive classification of the day's high reading to provide text to a weather forecast we're distributing.

To do this, we first make a function called classify_max_temp(), as shown in <u>Listing 17-24</u>.

```
CREATE OR REPLACE FUNCTION classify max temp()
    RETURNS trigger AS
$$
BEGIN
  1 CASE
       WHEN NEW.max temp >= 90 THEN
           NEW.max temp group := 'Hot';
       WHEN NEW.max temp >= 70 AND NEW.max temp < 90 THEN
           NEW.max temp group := 'Warm';
       WHEN NEW.max temp >= 50 AND NEW.max temp < 70 THEN
           NEW.max temp group := 'Pleasant';
       WHEN NEW.max temp >= 33 AND NEW.max temp < 50 THEN
           NEW.max temp group := 'Cold';
       WHEN NEW.max temp >= 20 AND NEW.max temp < 33 THEN
           NEW.max_temp_group := 'Frigid';
       WHEN NEW.max temp < 20 THEN
           NEW.max temp group := 'Inhumane';
       ELSE NEW.max temp group := 'No reading';
    END CASE;
    RETURN NEW;
END;
$$ LANGUAGE plpgsql;
```

Listing 17-24: Creating the classify_max_temp() function

By now, these functions should look familiar. What's new here is the PL/pgSQL version of the CASE syntax 1, which differs slightly from the SQL syntax. The PL/pgSQL syntax includes a semicolon after each WHEN

... THEN clause. Also new is the assignment operator :=, which we use to assign the descriptive name to the NEW.max_temp_group column based on the outcome of the CASE function. For example, the statement NEW.max_temp_group := 'Cold' assigns the string 'Cold' to NEW.max_temp_group when the temperature value is greater than or equal to 33 degrees but less than 50 degrees Fahrenheit. When the function returns the NEW row to be inserted in the table, it will include the string value Cold. Run the code to create the function.

Next, using the code in <u>Listing 17-25</u>, create a trigger to execute the function each time a row is added to temperature test.

```
CREATE TRIGGER temperature_insert

1   BEFORE INSERT
   ON temperature_test
2   FOR EACH ROW
3   EXECUTE PROCEDURE classify_max_temp();
```

Listing 17-25: Creating the temperature insert trigger

In this example, we classify max_temp and create a value for max_temp_group prior to inserting the row into the table. Doing so is more efficient than performing a separate update after the row is inserted. To specify that behavior, we set the temperature_insert trigger to fire BEFORE INSERT 1.

We also want the trigger to fire FOR EACH ROW 2 because we want each max_temp recorded in the table to get a descriptive classification. The final EXECUTE PROCEDURE statement names the classify_max_temp() function 3 we just created. Run the CREATE TRIGGER statement in pgAdmin, and then test the setup using <u>Listing 17-26</u>.

```
INSERT INTO temperature_test
VALUES
    ('North Station', '1/19/2023', 10, -3),
        ('North Station', '3/20/2023', 28, 19),
        ('North Station', '5/2/2023', 65, 42),
        ('North Station', '8/9/2023', 93, 74),
        ('North Station', '12/14/2023', NULL, NULL);
```

Listing 17-26: Inserting rows to test the temperature insert trigger

Here we insert five rows into temperature_test, and we expect the temperature_insert trigger to fire for each row—and it does! The SELECT statement in the listing should display these results:

station_name observation_date max_temp min_temp max_temp_group				
North Station	2023-01-19	10	-3	Inhumane
North Station	2023-03-20	28	19	Frigid
North Station	2023-05-02	65	42	Pleasant
North Station	2023-08-09	93	74	Hot
North Station	2023-12-14			No reading

Thanks to the trigger and function, each <code>max_temp</code> inserted automatically receives the appropriate classification in the <code>max_temp_group</code> column—including the instance where we had no reading for that value. Note that the trigger's update of the column will override any user-supplied values during insert.

This temperature example and the earlier grade-change auditing example are rudimentary, but they give you a glimpse of how useful triggers and functions can be in simplifying data maintenance.

Wrapping Up

Although the techniques you learned in this chapter begin to merge with those of a database administrator, you can apply the concepts to reduce the amount of time you spend repeating certain tasks. I hope these approaches will help you free up more time to find interesting stories in your data.

This chapter concludes our discussion of analysis techniques and the SQL language. The next two chapters offer workflow tips to help you increase your command of PostgreSQL. They include how to connect to a

database and run queries from your computer's command line and how to maintain your database.

TRY IT YOURSELF

Review the concepts in the chapter with these exercises:

Create a materialized view that displays the number of New York City taxi trips per hour. Use the taxi data from Chapter 12 and the query in <u>Listing 12-8</u>. How do you refresh the view if you need to?

In Chapter 11, you learned how to calculate a rate per thousand. Turn that formula into a rate_per_thousand() function that takes three arguments to calculate the result:

observed number, base number, and decimal places.

In Chapter 10, you worked with the <code>meat_poultry_egg_establishments</code> table that listed food processing facilities. Write a trigger that automatically adds an inspection deadline timestamp six months in the future whenever you insert a new facility into the table. Use the <code>inspection_deadline</code> column added in <code>Listing_10-19</code>. You should be able to describe the steps needed to implement a trigger and how the steps relate to each other.

18 USING POSTGRESQL FROM THE COMMAND LINE



In this chapter, you'll learn how to work with PostgreSQL from the *command line*, a text-based interface where you enter names of programs or other commands to perform tasks, such as

editing files or listing the contents of a file directory.

The command line—also called a *command line interface*, a *console*, a *shell*, or the *terminal*—existed long before computers had a graphical user interface (GUI) with menus, icons, and buttons you could click for navigation. Back in college, to edit a file, I had to enter commands into a terminal connected to an IBM mainframe computer. Working that way felt mysterious, as though I'd attained new powers—and I had! Today, even in a GUI world, familiarity with the command line is essential for a programmer moving toward expert-level skills. Perhaps that's why when a movie wants to convey that a character really knows what they're doing on a computer, they're shown typing cryptic, text-only commands.

As we learn about this text-only world, pay attention to these advantages of mastering working from the command line instead of a GUI, such as pgAdmin:

You can often work faster by entering short commands instead of clicking through layers of menu items.

You gain access to functions that only the command line provides.

If command line access is all you have to work with (for example, when you've connected to a remote computer), you can still get work done.

We'll use psql, a command-line tool included with PostgreSQL that lets you run queries, manage database objects, and interact with the computer's operating system via text command. You'll learn how to set up and access your computer's command line and then launch psql. Along the way, we'll cover general command line syntax and additional commands for database tasks. Patience is key: even experienced experts often resort to documentation to recall the available command line options.

Setting Up the Command Line for psql

To start, we'll access the command line on our operating system and, if needed, set an environment variable called PATH that tells our system where to find psql. *Environment variables* hold parameters that specify system or application configurations, such as where to store temporary files; they also allow you to enable or disable options. The PATH environment variable stores the names of one or more directories containing executable programs, and in this instance will tell the command line interface the location of psql, avoiding the hassle of having to enter its full directory path each time you launch it.

Windows psql Setup

On Windows, you'll run psql within the *Command Prompt*, the application that provides that system's command line interface. Before we do that, we need to tell Command Prompt where to find *psql.exe*—the full name of the psql application on Windows.

Adding psql and Utilities to the Windows PATH

The following steps assume that you installed PostgreSQL according to the instructions described in "Windows Installation" in Chapter 1. (If you installed PostgreSQL another way, use the Windows File Explorer to search your C: drive to find the directory that holds *psql.exe*, and then replace

C:\Program Files\PostgreSQL\x\bin in the following steps with your own path.)

Open the Windows Control Panel by clicking the **Search** icon on the Windows taskbar, entering **Control Panel**, and then clicking the **Control Panel** icon.

Inside the Control Panel app, enter **Environment** in the search box. In the list of search results displayed, click **Edit the System Environment Variables**. A System Properties dialog should appear.

In the System Properties dialog, on the Advanced tab, click **Environment Variables**. The dialog that opens should have two sections: User variables and System variables. In the User variables section, if you don't see a PATH variable, continue to step a to create a new one. If you do see an existing PATH variable, continue to step b to modify it.

If you don't see PATH in the User variables section, click **New** to open a New User Variable dialog, shown in *Figure 18-1*.

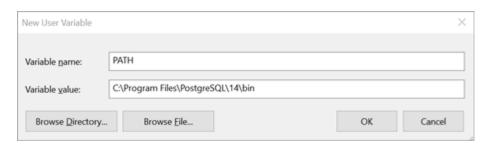


Figure 18-1: Creating a new PATH environment variable in Windows 10

In the Variable name box, enter **PATH**. In the Variable value box, enter **C:\Program Files\PostgreSQL\x\bin**, where *x* is the version of PostgreSQL you're using. (Instead of typing, you can click **Browse Directory** and navigate to the directory in the Browse For Folder dialog.) When you've either entered the path manually or browsed to it, click **OK** in all dialogs to close them.

If you do see an existing PATH variable in the User variables section, highlight it and click **Edit**. In the list of variables that displays, click **New** and enter **C:\Program Files\PostgreSQL\x\bin**, where *x* is the version of PostgreSQL you're using. (Instead of typing, you can click **Browse Directory** and navigate to the directory in the Browse For Folder dialog.)

The result should look like the highlighted line in <u>Figure 18-2</u>. When you're finished, click **OK** in all dialogs to close them.

Now when you launch Command Prompt, the PATH should include the directory. Note that any time you make changes to the PATH, you must close and reopen Command Prompt for the changes to take effect. Next, let's set up Command Prompt.

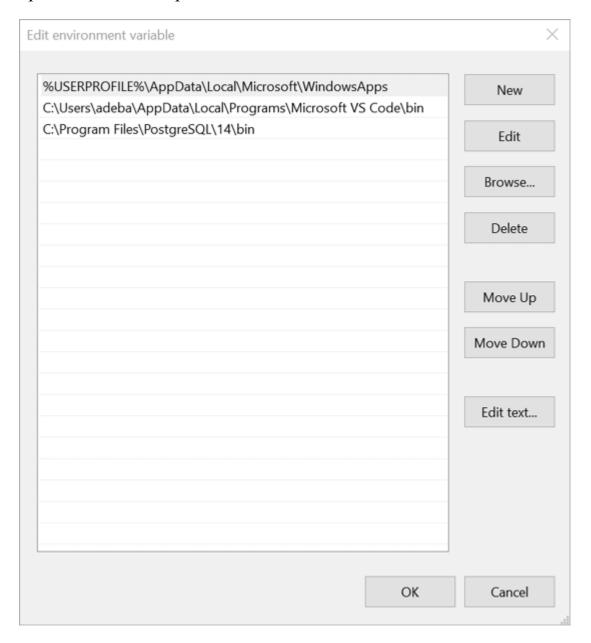


Figure 18-2: Editing existing PATH environment variables in Windows 10

Launching and Configuring Windows Command Prompt

Command Prompt is an executable file named *cmd.exe*. To launch it, select **Start>Windows System>Command Prompt** or enter **cmd** into the search bar. When the application opens, you should see a window with a black background that displays version and copyright information along with a prompt showing your current directory. On my Windows 10 system, Command Prompt opens to my default user directory and displays C:\Users\adeba>, as shown in *Figure 18-3*.

This line is known as the *prompt*, and it shows the current working directory. For me, this is my C: drive, which is typically the main hard drive on a Windows system, and the \users\adeba directory on that drive. The greater-than sign > indicates the area where you enter your commands.

NOTE

For fast access to Command Prompt, you can add it to your Windows taskbar. When Command Prompt is running, right-click its icon on the taskbar and then click **Pin to taskbar**.

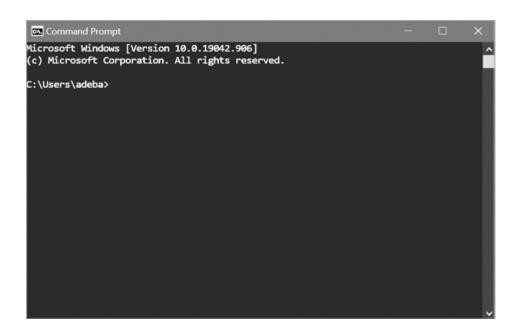


Figure 18-3: My Command Prompt in Windows 10

You can customize the font and colors plus access other settings by clicking the Command Prompt icon at the left of its window bar and selecting **Properties** from the menu. To make Command Prompt more suited for query output, I recommend setting the window size (on the Layout tab) to a width of at least 80 and a height of 25. For the font, the official PostgreSQL documentation recommends using Lucida Console to properly display all the characters.

Entering Instructions on Windows Command Prompt

Now you're ready to enter instructions in Command Prompt. Enter **help** at the prompt, and press ENTER on your keyboard to see a list of available Windows system commands. You can view information about a command by including its name after help. For example, enter help time to display information about using the time command to set or view the system time.

Exploring the full workings of Command Prompt is an enormous topic beyond the scope of this book; however, I encourage you to try some of the commands in <u>Table 18-1</u>, which contains useful frequently used commands that aren't actually necessary for the exercises in this chapter.

Table 18-1: Useful Windows Commands

Co m ma nd	Function	Example	Action
cd	Change directory	cd C:\my-stuff	Changes to the <i>my-stuff</i> directory on the C: drive
У	Copy a file	<pre>copy C:\my- stuff\song.mp3 C:\Music\song_favori te.mp3</pre>	Copies the song.mp3 file from my-stuff to a new file called song_favorite.mp3 in the Music directory
del	Delete	del *.jpg	Deletes all files with a .jpg extension in the current directory (asterisk wildcard)
dir	List directory contents	dir /p	Shows directory contents one screen at a time (using the /p option)
fin dst r	Find strings in text files matching a regular expression	findstr "peach" *.txt	Searches for the text <i>peach</i> in all .txt files in the current directory
mkd ir	Make a new directory	makedir C:\my- stuff\Salad	Creates a Salad directory inside the my-stuff directory
mov e	Move a file	move C:\my- stuff\song.mp3 C:\Music\	Moves the file song.mp3 to the C:\Music directory

With your Command Prompt open and configured, you're ready to roll. Skip ahead to the section "Working with psql."

macOS psql Setup

On macOS, you'll run psql within Terminal, the application that provides access to that system's command line via one of several *shell* programs such as bash or zsh. Shell programs on Unix- or Linux-based systems, including macOS, provide not only the command prompt where users enter instructions, but also their own programming language for automating tasks. For example, you can use bash commands to write a program to log in to a remote computer, transfer files, and log out.

If you followed the Postgres.app setup instructions for macOS in Chapter 1—including running the commands at your Terminal—you shouldn't need

additional configuration to use psql and associated commands. Instead, we'll proceed to launching Terminal.

Launching and Configuring the macOS Terminal

Launch Terminal by navigating to **Applications**▶ **Utilities**▶ **Terminal**. When it opens, you should see a window that displays the date and time of your last login followed by a prompt that includes your computer name, current working directory, and username. On my Mac, which is set to the bash shell, the prompt displays as ad: ~ anthony\$ and ends with a dollar sign (\$), as shown in *Figure 18-4*.

The tilde (~) represents the system's home directory, which is /Users/anthony. Terminal doesn't display the full directory path, but you can see that information at any time by entering the pwd command (short for *print working directory*) and pressing ENTER on your keyboard. The area after the dollar sign is where you enter commands.

If your Mac is set to another shell such as zsh, your prompt may look different. With zsh, for example, the prompt ends with a percent sign. The particular shell you're using does not make a difference for these exercises.

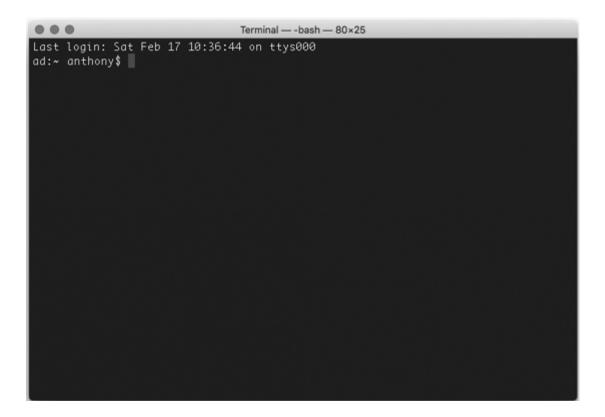


Figure 18-4: Terminal command line in macOS

NOTE

For fast access to Terminal, add it to your macOS Dock. While Terminal is running, right-click its icon and select **Options**▶**Keep in Dock**.

If you've never used Terminal, its default black-and-white color scheme might seem boring. You can change fonts, colors, and other settings by selecting **Terminal Preferences**. To make Terminal bigger to better fit the query output display, I recommend setting the window size (on the Window tab under Profiles) to a width of at least 80 columns and a height of 25 rows. My preferred font (on the Text tab) is Monaco 14, but experiment to find one you like.

Exploring the full workings of Terminal and related commands is an enormous topic beyond the scope of this book, but take some time to try several commands. <u>Table 18-2</u> lists some useful commonly used commands that aren't actually necessary for the exercises in this chapter. Enter man

(short for *manual*) followed by a command name to get help on any command. For example, you can use man 1s to find out how to use the 1s command to list directory contents.

Table 18-2: Useful Terminal Commands

Co mm and	Function	Example	Action
cd	Change directory	cd /Users/pparker /my-stuff/	Changes to the <i>my-stuff</i> directory
ср	Copy files	cp song.mp3 song_backup.mp 3	Copies the file song.mp3 to song_backup.mp3 in the current directory
grep	Find strings in a text file matching a regular expression	grep 'us_counties_2 010' *.sql	Finds all lines in files with a .sql extension that have the text us_counties_2010
ls	List directory contents	ls -al	Lists all files and directories (including hidden) in "long" format
mkdi r	Make a new directory	mkdir resumes	Makes a directory named <i>resumes</i> under the current working directory
mv	Move a file	mv song.mp3 /Users/pparker /songs	Moves the file <i>song.mp3</i> from the current directory to a /songs directory under a user directory
rm	Remove (delete) files	rm *.jpg	Deletes all files with a .jpg extension in the current directory (asterisk wildcard)

With your Terminal open and configured, you're ready to roll. Skip ahead to the section "Working with psql."

Linux psql Setup

Recall from "Linux Installation" in Chapter 1 that methods for installing PostgreSQL vary according to your Linux distribution. Nevertheless, psql is part of the standard PostgreSQL install, and you probably already ran psql commands as part of the installation process via your distribution's command line terminal application. Even if you didn't, standard Linux installations of PostgreSQL will automatically add psql to your PATH, so you should be able to access it.

Launch a terminal application and proceed to the next section, "Working with psql." On some distributions, such as Ubuntu, you can open a terminal by pressing CTRL-ALT-T. Also note that the Mac Terminal commands in <u>Table 18-2</u> apply to Linux as well and may be useful to you.

Working with psql

Now that you've identified your command line interface and set it up to recognize the location of psql, let's launch psql and connect to a database on your local installation of PostgreSQL. Then we'll explore executing queries and special commands for retrieving database information.

Launching psql and Connecting to a Database

Regardless of the operating system you're using, you start psql in the same way. Open your command line interface (Command Prompt on Windows, Terminal on macOS or Linux). To launch psql and connect to a database, we use the following pattern at the command prompt:

```
psql -d database_name -U user_name
```

Following the psql application name, we provide the database name after a -d database argument and a username after the -u username argument.

For the database name, we'll use analysis, which is where we created our tables and other objects for the book's exercises. For username, we'll use postgres, which is the default user created during installation. So, to connect to the analysis database on your local server, enter this at the command line:

```
psql -d analysis -U postgres
```

Note that you can connect to a database on a remote server by specifying the -h argument followed by the hostname. For example, you would use the following line if you were connecting to a database named analysis on a server called example.com:

```
psql -d analysis -U postgres -h example.com
```

Either way, if you set a password during installation, you should receive a password prompt when psql launches. If so, enter your password. After psql connects to the database, you should then see a prompt that looks like this:

```
psql (13.3)
Type "help" for help.
analysis=#
```

Here, the first line lists the version number of psql and the server you're connected to. Your version will vary depending on when you installed PostgreSQL. The prompt where you'll enter commands is analysis=#, which refers to the name of the database, followed by an equal sign (=) and a hash mark (#). The hash mark indicates that you're logged in with *superuser* privileges, which give you unlimited ability to access and create objects and set up accounts and security. If you're logged in as a user without superuser privileges, the last character of the prompt will be a greater-than sign (>). As you can see, the user account you logged in with here (postgres) is a superuser.

NOTE

PostgreSQL installations create a default superuser account called postgres. If you're running Postgres.app on macOS, that installation created an additional superuser account that has your system username and no password.

Finally, on Windows systems, you may see a warning message after launching psql about the console code page differing from the Windows code page. This is related to a mismatch in character sets between Command Prompt and the rest of the Windows system. For the exercises in this book, you can safely ignore that warning. If you prefer, you can eliminate it on a per-session basis by entering the command cmd.exe /c chcp 1252 in your Windows Command Prompt before launching psql.

Getting Help or Exiting

At the psql prompt, you can get help for both psql and general SQL with a set of *meta-commands*, detailed in *Table 18-3*. Meta-commands, which begin with a backslash (\), go beyond offering help—we'll cover several that return information about the database, let you adjust settings, or process data.

Table 18-3: Help Commands Within psql

Comman d	Displays
\?	Commands available within psql, such as \dt to list tables.
\?	Options for use with the $psql$ command, such as $-u$ to specify username.
\? variables	Variables for use with psql, such as VERSION for the current psql version.
\h	List of SQL commands. Add a command name to see detailed help for it (for example, \h INSERT).

Even experienced users often need a refresher on commands and options, so having the details in the psql application is handy. To exit psql, use the meta-command \q (for *quit*).

Changing the Database Connection

When working with SQL, it's not unusual to be working with multiple databases, so you need a way to switch between databases. You can do this easily at the psql prompt using the \c meta-command.

For example, while connected to your analysis database, at the psql prompt enter the following command to create a database named test:

```
analysis=# CREATE DATABASE test;
```

Then, to connect to the new test database you just created, enter \c followed by the name of the database at the psql prompt (and provide your PostgreSQL password if asked):

```
analysis=# \c test
```

The application should respond with the following message:

```
You are now connected to database "test" as user "postgres". test=#
```

The prompt will show you which database you're connected to. To log in as a different user—for example, using a username the macOS installation created—you could add that username after the database name. On my Mac, the syntax looks like this:

```
analysis-# \c test anthony

The response would be as follows:

You are now connected to database "test" as user "anthony".
test=#
```

To reduce clutter, you can remove the test database you created. First, use \c to disconnect from test and connect to the analysis database (we can remove a database only if no one is connected to it). Once you've connected to analysis, enter DROP DATABASE test; at the psql prompt.

Setting Up a Password File

If you'd rather not see a password prompt when starting psql, you can set up a file to store database connection information that includes the server name, your username, and password. On startup, psql will read the file and bypass the password prompt if the file contains an entry that matches the database connection and username.

On Windows 10, the file must be named *pgpass.conf* and must reside in the following directory:

C:\USERS\YourUsername\AppData\Roaming\postgresql\. You may need to create the postgresql directory. On macOS and Linux, the file must be named .pgpass and must reside in your user home directory. The documentation at https://www.postgresql.org/docs/current/libpq-pgpass.html notes that on macOS and Linux, you may need to set file permissions after creating the file by running chmod 0600 ~/.pgpass at the command line

Create the file using a text editor and save it with the correct name and location for your system. Inside, you'll need to add a line for each database connection in the following format:

```
hostname:port:database:username:password
```

For example, to set up a connection for the analysis database and postgres username, enter this line, substituting your password:

```
localhost:5432:analysis:postgres:password
```

You can substitute an asterisk in any of the first four parameters to serve as a wildcard. For example, to supply a password for any local database with the postgres username, substitute an asterisk for the database name:

```
localhost:5432:*:postgres:password
```

Saving your password will save you some typing, but be mindful of best practices regarding security. Always secure your computer with a strong password and/or physical security key, and don't create a password file on any public or shared system.

Running SQL Queries on psql

We've configured psql and connected to a database, so now let's run some SQL queries. We'll start with a single-line query and then run a multiple-line query.

You enter SQL into psql directly at the prompt. For example, to see a few rows from the 2019 census table we've used throughout the book, enter a query at the prompt, as shown in <u>Listing 18-1</u>.

```
analysis=# SELECT county_name FROM us_counties_pop_est_2019
ORDER BY county_name LIMIT 3;
```

Listing 18-1: Entering a single-line query in psql

Press ENTER to execute the query, and psql should display the following results in your terminal in text including the number of rows

returned:

Below the result, you can see the analysis=# prompt again, ready for further input. You can use the up and down arrows on your keyboard to scroll through recent queries and press ENTER to execute them again, avoiding having to retype them.

Entering a Multiline Query

You're not limited to single-line queries. If you have a query that spans multiple lines, you can enter lines one at a time, pressing ENTER after each, and psql knows not execute the query until you provide a semicolon. Let's reenter the query in *Listing 18-1* over multiple lines, shown in *Listing 18-2*.

```
analysis=# SELECT county_name
analysis-# FROM us_counties_pop_est_2019
analysis-# ORDER BY county_name
analysis-# LIMIT 3;
```

Listing 18-2: Entering a multiline query in psql

Note that when your query extends past one line, the symbol between the database name and the hash mark changes from an equal sign to a hyphen. This multiline query executes only when you press ENTER after the final line, which ends with a semicolon.

Checking for Open Parentheses in the psql Prompt

Another helpful feature of psql is that it shows when you haven't closed a pair of parentheses. *Listing 18-3* shows this in action.

```
analysis=# CREATE TABLE wineries (
analysis(# id bigint,
analysis(# winery_name text
analysis(#);
CREATE TABLE
```

Listing 18-3: Showing open parentheses in the psql prompt

Here, you create a simple table called wineries that has two columns. After entering the first line of the CREATE TABLE statement and an open parenthesis ((), the prompt then changes from analysis=# to analysis (# to include an open parenthesis. This reminds you an open parenthesis needs closing. The prompt maintains that configuration until you add the closing parenthesis.

NOTE

If you have a lengthy query saved in a text file, such as one from this book's resources, you can copy it to your computer clipboard and paste it into psql (CTRL-V on Windows, COMMAND-V on macOS, and SHIFT-CTRL-V on Linux). That saves you from typing the whole query. After you paste the query text into psql, press ENTER to execute it.

Editing Queries

To modify the most recent query you've executed in psql, you can edit it using the \e or \edit meta-command. Enter \e to open the last-executed query in a text editor. The editor psql uses by default depends on your operating system.

On Windows, psql will open Notepad, a simple GUI text editor. Edit your query, save it by choosing **File>Save**, and then exit Notepad using **File>Exit**. When Notepad closes, psql should execute your revised query.

On macOS and Linux, psql uses a command line application called vim, which is a favorite among programmers but can seem inscrutable for beginners. Check out a helpful vim cheat sheet at https://vim.rtorr.com/. For now, you can use the following steps to make simple edits:

- When vim opens the query in your terminal, press I to activate insert mode.
- Make your edits to the query.

Press ESC and then SHIFT-: to display a colon command prompt at the bottom left of the vim screen, which is where you enter commands to control vim.

Enter wq (for write, quit) and press ENTER to save your changes.

Now when vim exits, the psql prompt should execute your revised query. Press the up-arrow key to see the revised text.

Navigating and Formatting Results

The query you ran in Listings 18-1 and 18-2 returned only one column and a handful of rows, so its output was contained nicely in your command line interface. But for queries with more columns or rows, the output can fill more than one screen, making it difficult to navigate. Fortunately, you have several ways to customize the display style of the output using the \pset meta-command.

Setting Paging of Results

One way to adjust the output format is to specify how psql handles scrolling through lengthy query results, known as *paging*. By default, if your results return more rows than will fit on one screen, psql will display the first screen's worth of rows and then let you scroll through the rest. For example, *Listing 18-4* shows what happens at the psql prompt when we remove the LIMIT clause from the query in *Listing 18-1*.

analysis=# SELECT county_name FROM us_counties_pop_est_2019
ORDER BY county_name;

county_name

Abbeville County
Acadia Parish
Accomack County
Ada County
Adair County
Adair County

```
Adair County
Adair County
Adams County
Adams County
Adams County
Adams County
-- More --
```

Listing 18-4: A query with scrolling results

Recall that this table has 3,142 rows. <u>Listing 18-4</u> shows only the first 12 on the current screen (the number of visible rows depends on your terminal configuration). On Windows, the indicator -- More -- tells you that additional results are available, and you can press ENTER to scroll through them. On macOS and Linux, the indicator will be a colon. Scrolling through a few thousand rows will take a while. Press Q to exit the results and return to the psql prompt.

To bypass manual scrolling and have all your results immediately display, you can change the pager setting using the pager metacommand. Run that command at your psql prompt, and it should return the message pager usage is off. Now when you rerun the query in <u>Listing</u> <u>18-3</u> with the pager setting turned off, you should see results like this:

```
--snip--
York County
York County
York County
York County
Young County
Yuba County
Yuba County
Yukon-Koyukuk Census Area
Yuma County
Yuma County
Zapata County
Zavala County
Ziebach County
(3142 rows)
analysis=#
```

You're immediately taken to the end of the results without having to scroll. To turn paging back on, run \pset pager again.

Formatting the Results Grid

You also can use \pset with the following options to format the results:

border int

Use this option to specify whether the results grid has no border (0), internal lines dividing columns (1), or lines around all cells (2). For example, \pset border 2 sets lines around all cells.

format unaligned

Use the option \pset format unaligned to display the results in lines separated by a delimiter rather than in columns, similar to what you would see in a CSV file. The separator defaults to a pipe symbol (|). You can set a different separator using the fieldsep command. For example, to set a comma as the separator, run \pset fieldsep ','. To revert to a column view, run \pset format aligned. You can use the psql meta-command \a to toggle between aligned and unaligned views.

footer

Use this option to toggle the results footer, which displays the result row count, on or off.

null

Use this option to set how psql displays NULL values. By default, they show as blanks. You can run \pset null '(null)' to replace blanks with (null) when the column value is NULL.

You can explore additional options in the PostgreSQL documentation at https://www.postgresql.org/docs/current/app-psql.html. In addition, it's possible to set up a <code>.psqlrc</code> file on macOS or Linux or a <code>psqlrc.conf</code> file on Windows to hold your configuration preferences and load them each time <code>psql</code> starts. A good example is provided at https://www.citusdata.com/blog/2017/07/16/customizing-my-postgres-shell-using-psqlrc/.

Viewing Expanded Results

Sometimes, it's helpful to view results arranged not in the typical table style of rows and columns, but instead in a vertical list. This is useful when the number of columns is too big to fit on-screen in the normal horizontal results grid and also for scanning values in columns row by row. In psql, you can switch to a vertical list view using the \x (for *expanded*) metacommand. The best way to understand the difference between normal and expanded view is by looking at an example. *Listing 18-5* shows the normal display you see when querying the grades table in Chapter 17 using psql.

Listing 18-5: Normal display of the grades table query

To change to the expanded view, enter \x at the psql prompt, which should display the message Expanded display is on. Then, when you run the same query again, you should see the expanded results, as shown in <u>Listing 18-6</u>.

```
analysis=# SELECT * FROM grades ORDER BY student_id,
course_id;
-[RECORD 1]------
student_id | 1
course_id | 1
course_id | 1
course | Biology 2
grade | C
-[RECORD 2]------
student_id | 1
course_id | 2
course | English 11B
grade | D
-[RECORD 3]------
student_id | 1
course_id | 1
course_id | 3
```

Listing 18-6: Expanded display of the grades table query

The results appear in vertical blocks separated by record numbers. Depending on your needs and the type of data you're working with, this format might be easier to read. You can revert to column display by entering \x again at the psql prompt. In addition, setting \x auto will make PostgreSQL automatically display the results in a table or expanded view based on the size of the output.

Next, let's explore how to use psql to dig into database information.

Meta-Commands for Database Information

You can have psql display details about databases, tables, and other objects via a particular set of meta-commands. To see how these work, we'll explore the meta-command that displays the tables in your database, including how to append a plus sign (+) to the command to expand the output and add an optional pattern to filter the output.

To see a list of tables, you can enter \at at the psql prompt. Here's a snippet of the output on my system:

```
List of relations
                             | Type |
Schema |
               Name
Owner
______
public | acs 2014 2018 stats
                            | table |
anthony
anthony
public | char data types
                             | table |
anthony
                     | table |
public | check constraint example
anthony
```

This result lists all tables in the current database alphabetically.

You can filter the output by adding a pattern the database object name must match. For example, use \dt us* to show only tables whose names begin with us (the asterisk acts as a wildcard). The results should look like this:

	List of relation	S	
Schema	Name	Type	Owner
public public public	us_counties_2019_shp us_counties_2019_top10 us_counties_pop_est_2010 us_counties_pop_est_2019 us_exports	table table table	anthony

<u>Table 18-4</u> shows several additional commands you might find helpful, including \1, which lists the databases on your server. Adding a plus sign to each command, as in \dt+, adds more information to the output, including object sizes.

Table 18-4: Example of psql \d Commands

Command	Displays		
\d [pattern]	Columns, data types, plus other information on objects		
\di [pattern]	Indexes and their associated tables		
\dt [pattern]	Tables and the account that owns them		
\du [pattern]	User accounts and their attributes		
\dv [pattern]	Views and the account that owns them		
\dx [pattern]	Installed extensions		
\l [pattern]	Databases		

The entire list of commands is available in the PostgreSQL documentation at https://www.postgresql.org/docs/current/app-psql.html, or you can see details by using the \? command noted earlier.

Importing, Exporting, and Using Files

In this section, we'll explore how to use psql to import and export data from the command line, which can be necessary when you're connected to remote servers, such as Amazon Web Services instances of PostgreSQL. We'll also use psql to read and execute SQL commands stored in a file and learn the syntax for sending psql output to a file.

Using \copy for Import and Export

In Chapter 5, you learned how to use the PostgreSQL COPY command to import and export data. It's a straightforward process, but it has one significant limitation: the file you're importing or exporting must be on the same machine as the PostgreSQL server. That's fine if you're working on your local machine, as you've been doing with these exercises. But if you're connecting to a database on a remote computer, you might not have access to its file system. You can get around this restriction by using the \copy meta-command in psql.

The \copy meta-command works just like the PostgreSQL copy, except when you execute it at the psql prompt, it will route data from your machine to the server you're connected to, whether local or remote. We won't actually connect to a remote server to try this since it's rare to find a public remote server we could connect to, but you can still learn the syntax by using the commands on our local analysis database.

In <u>Listing 18-7</u>, at the psql prompt we use a DELETE statement to remove all the rows from the small state_regions table you created in Chapter 10 and then import data using \copy. You'll need to change the file path to match the location of the file on your computer.

```
analysis=# DELETE FROM state_regions;
DELETE 56
analysis=# \copy state_regions FROM
'C:\YourDirectory\state_regions.csv' WITH (FORMAT CSV,
HEADER);
COPY 56
```

Listing 18-7: Importing data using \copy

Next, to import the data, we use \copy with the same syntax used with PostgreSQL COPY, including a FROM clause with the file path on your machine, and a WITH clause that specifies the file is a CSV and has a header row. When you execute the statement, the server should respond with COPY 56, letting you know the rows have been successfully imported.

If you're connected to a remote server via psql, you would use the same \copy syntax, and the command would route your local file to the remote server for importing. In this example, we used \copy FROM to import a file. We could also use \copy TO for exporting. Let's look at an alternate way to import or export data (or run other SQL commands) via psql.

Passing SQL Commands to psql

By placing a command in quotes after the -c argument, we can send it to our connected server, local or remote. The command can be a single SQL statement, multiple SQL statements separated by semicolons, or a meta-command. This can allow us to run psql, connect to a server, and execute a command in a single command line statement—handy if we want to incorporate psql statements into shell scripts to automate tasks.

For example, we can import data to the state_regions table with the statement in <u>Listing 18-8</u>, which must be entered on one line at your command prompt (and not inside psql).

```
psql -d analysis -U postgres -c1 'COPY state_regions FROM STDIN2 WITH (FORMAT CSV, HEADER);' <3 C:\YourDirectory\state_regions.csv
```

Listing 18-8: Importing data using psql with COPY

To try it, you'll need to first run DELETE FROM state_regions; inside psql to clear the table. Then exit psql by typing the meta-command \q.

At your command prompt, enter the statement in <u>Listing 18-8</u>. We first use psql and the -d and -u commands to connect to your analysis database. Then comes the -c command 1, which we follow with the PostgreSQL statement for importing the data. The statement is similar to COPY statements we've used with one exception: after FROM, we use the

keyword STDIN 2 instead of the complete file path and filename. STDIN means "standard input," which is a stream of input data that can come from a device, a keyboard, or in this case the file *state_regions.csv*, which we direct 3 to psql using the less-than (<) symbol. You'll need to supply the full path to the file.

Running this entire command at your command prompt should import the CSV file and generate the message COPY 56.

Saving Query Output to a File

It's sometimes helpful to save the query results and messages generated during a psql session to a file, such as to keep a history of your work or to use the output in a spreadsheet or other application. To send query output to a file, you can use the \o meta-command along with the full path and name of an output file that psql will create.

NOTE

On Windows, file paths for the \o command must use either Linuxstyle forward slashes, such as C:/my-stuff/my-file.txt, or double backslashes, such as C:\my-stuff\my-file.txt.

For example, in <u>Listing 18-9</u> we change the psql format style from a table to CSV and then output query results directly to a file.

```
1 analysis=# \pset format csv
   Output format is csv.

analysis=# SELECT * FROM grades ORDER BY student_id,
   course_id;
2 student_id, course_id, course, grade
   1,1,Biology 2,F
   1,2,English 11B,D
   1,3,World History 11B,C
   1,4,Trig 2,B
3 analysis=# \o 'C:/YourDirectory/query output.csv'
```

```
analysis=# SELECT * FROM grades ORDER BY student_id,
  course_id;
4 analysis=#
```

Listing 18-9: Saving query output to a file

First, we set the output format 1 using the meta-command \pset format csv. When you run a simple SELECT on the grades table, the output 2 should return as values separated by commas. Next, to send that data to a file the next time you run the query, use the \o meta-command and then provide a complete path to a file called query_output.csv 3. When you run the SELECT query again, there should be no output to the screen 4. Instead, you'll find a file with the contents of the query in the directory specified at 3.

Note that every time you run a query from this point, the output is appended to the same file specified after the \o (for *output*) command. To stop saving output to that file, you can either specify a new file or enter \o with no filename to resume having results output to the screen.

Reading and Executing SQL Stored in a File

To run SQL stored in a text file, you execute psql on the command line and supply the filename after an -f (for file) argument. This syntax lets you quickly run a query or table update from the command line or in conjunction with a system scheduler to run a job at regular intervals.

Let's say you saved the SELECT query from <u>Listing 18-9</u> in a file called *display-grades.sql*. To run the saved query, use the following psql syntax at your command line:

```
psql -d analysis -U postgres -f C:\YourDirectory\display-
grades.sql
```

When you press ENTER, psql should launch, run the stored query in the file, display the results, and exit. For repetitive tasks, this workflow can save considerable time because you avoid launching pgAdmin or rewriting a query. You also can stack multiple queries in the file so they run in

succession, which, for example, you might do if you want to run several updates on your database.

Additional Command Line Utilities to Expedite Tasks

PostgreSQL also has its own set of command line utilities that you can enter in your command line interface without launching psql. A listing is available at https://www.postgresql.org/docs/current/reference-client.html, and I'll explain several in Chapter 19 that are specific to database maintenance. Here I'll cover two that are particularly useful: creating a database at the command line with the createdb utility and loading shapefiles into a PostGIS database via the shp2pgsql utility.

Adding a Database with createdb

Earlier in the chapter, you used CREATE DATABASE to add the database test to your PostgreSQL server. We can achieve the same thing using createdb at the command line. For example, to create a new database on your server named box office, run the following at your command line:

```
createdb -U postgres -e box_office
```

The -u argument tells the command to connect to the PostgreSQL server using the postgres account. The -e argument (for *echo*) prints the commands generated by created as output. Running this command creates the database and prints output to the screen ending with CREATE DATABASE box_office;. You can then connect to the new database via psql using the following line:

```
psql -d box_office -U postgres
```

The createdb command accepts arguments to connect to a remote server (just like psql does) and to set options for the new database. A full list of arguments is available at https://www.postgresql.org/docs/current/app-createdb.html. Again, the createdb command is a time-saver that comes in handy when you don't have access to a GUI.

Loading Shapefiles with shp2pgsql

In Chapter 15, you learned about shapefiles, which contain data describing spatial objects. On Windows and some Linux distributions, you can import shapefiles into a PostGIS-enabled database using the Shapefile Import/Export Manager GUI tool (generally) included with PostGIS. However, the Shapefile Import/Export Manager is not always included with PostGIS on macOS or some flavors of Linux. In those cases (or if you'd rather work at the command line), you can import a shapefile using the PostGIS command line tool <code>shp2pgsql</code>.

To import a shapefile into a new table from the command line, use the following syntax:

```
shp2pgsql -I -s SRID -W encoding shapefile_name table_name |
psql -d database -U user
```

A lot is happening in this single line. Here's a breakdown of the arguments (if you skipped Chapter 15, you might need to review it now):

- -I Uses GiST to add an index on the new table's geometry column.
- -s Lets you specify an SRID for the geometric data.
- -w Lets you specify encoding. (Recall that we used Latin1 for census shapefiles.)

shapefile_name The name (including full path) of the file ending with the .shp extension.

table_name The name of the table the shapefile is imported to.

Following these arguments, you place a pipe symbol (1) to direct the output of shp2pgsql to psql, which has the arguments for naming the database and user. For example, to load the *tl_2019_us_county.shp* shapefile into a us_counties_2019_shp table in the analysis database, you can run the following command. Note that although this command wraps onto two lines here, it should be entered as one line in the command line:

```
shp2pgsql -I -s 4269 -W Latin1 tl_2019_us_county.shp us_counties_2019_shp | psql -d analysis -U postgres
```

The server should respond with a number of SQL INSERT statements before creating the index and returning you to the command line. It might take some time to construct the entire set of arguments the first time around, but after you've done one, subsequent imports should take less time. You can simply substitute file and table names into the syntax you already wrote.

Wrapping Up

Feeling mysterious and powerful yet? Indeed, when you delve into a command line interface and make the computer do your bidding using text commands, you enter a world of computing that resembles a sci-fi movie sequence. Not only does working from the command line save you time, it also helps you overcome barriers you might hit when working in environments that don't support graphical tools. In this chapter, you learned the basics of working with the command line plus PostgreSQL specifics. You discovered your operating system's command line application and set it up to work with psql. Then you connected psql to a database and learned how to run SQL queries via the command line. Many experienced computer users prefer to use the command line for its simplicity and speed once they become familiar with using it. You might, too.

In Chapter 19, we'll review common database maintenance tasks including backing up data, changing server settings, and managing the growth of your database. These tasks will give you more control over your working environment and help you better manage your data analysis projects.

TRY IT YOURSELF

To reinforce the techniques in this chapter, choose an example from an earlier chapter and try working through it using only the command line. Chapter 15, "Analyzing Spatial Data with PostGIS," is a good choice because it gives you the opportunity to work with psql and the shapefile loader shp2pgsql. That said, I encourage you to choose any example that you think you would benefit from reviewing.

19 MAINTAINING YOUR DATABASE



To wrap up our exploration of SQL, we'll look at key database maintenance tasks and options for customizing PostgreSQL. In this chapter, you'll learn how to track and conserve space

in your databases, how to change system settings, and how to back up and restore databases. How often you'll need to perform these tasks depends on your current role and interests. If you want to be a *database administrator* or a *backend developer*, the topics covered here are vital.

It's worth noting that database maintenance and performance tuning are large enough topics that they often occupy entire books, and this chapter mainly serves as an introduction to a handful of essentials. If you want to learn more, a good place to begin is with the resources in the appendix.

Let's start with the PostgreSQL VACUUM feature, which lets you shrink the size of tables by removing unused rows.

Recovering Unused Space with VACUUM

The PostgreSQL VACUUM command helps manage the size of a database, which—as discussed in "Improving Performance When Updating Large Tables" in Chapter 10—can grow as a result of routine operations.

For example, when you update a row value, the database creates a new version of that row with the updated value and retains (but hides) the old version of the row. The PostgreSQL documentation refers to these rows that you can't see as *dead tuples*, with *tuples*—an ordered list of elements—being the name for the internal implementation of rows in a PostgreSQL database. The same thing happens when you delete a row. Though the row is no longer visible to you, it lives on as a dead row in the table.

This is by design so the database can provide certain features in environments where multiple transactions are occurring, and an old version of a row might be needed by transactions other than the current one.

The VACUUM command cleans up these dead rows. Running VACUUM on its own designates the space occupied by dead rows as available for the database to use again (assuming that any transactions using the rows have been completed). In most cases, VACUUM doesn't return the space to your system's disk; it just flags that space as available for new data. To actually shrink the size of the data file, you can run VACUUM FULL, which rewrites the table to a new version that doesn't include the dead row space. It drops the old version.

Although VACUUM FULL frees space on your system's disk, there are a couple of caveats to keep in mind. First, VACUUM FULL takes more time to complete than VACUUM. Second, it must have exclusive access to the table while rewriting it, which means that no one can update data during the operation. The regular VACUUM command can run while updates and other operations are happening. Finally, not all dead space in a table is bad. In many cases, having available space to put new tuples instead of needing to ask the operating system for more disk space can improve performance.

You can run either VACUUM OF VACUUM FULL on demand, but PostgreSQL by default runs an *autovacuum* background process that monitors the database and runs VACUUM as needed. Later in this chapter, I'll show you how to monitor autovacuum as well as run the VACUUM command manually. But first, let's look at how a table grows as a result of updates and how you can track this growth.

Tracking Table Size

We'll create a small test table and monitor its growth as we fill it with data and perform an update. The code for this exercise, as with all resources for the book, is available at https://nostarch.com/practical-sql-2nd-edition/.

Creating a Table and Checking Its Size

<u>Listing 19-1</u> creates a vacuum_test table with a single column to hold an integer. Run the code, and then we'll measure the table's size.

```
CREATE TABLE vacuum_test (
    integer_column integer
);
```

Listing 19-1: Creating a table to test vacuuming

Before we fill the table with test data, let's check how much space it occupies on disk to establish a reference point. We can do so in two ways: check the table properties via the pgAdmin interface or run queries using PostgreSQL administrative functions. In pgAdmin, click once on a table to highlight it, and then click the **Statistics** tab. Table size is one of about two dozen indicators in the list.

I'll focus on the running queries technique here because knowing these queries is helpful if for some reason pgAdmin isn't available or you're using another graphical user interface (GUI). <u>Listing 19-2</u> shows how to check the vacuum test table size using PostgreSQL functions.

```
SELECT 1_{pg\_size\_pretty}( 2_{pg\_total\_relation\_size('vacuum\_test')});
```

Listing 19-2: Determining the size of vacuum_test

The outermost function, pg_size_pretty() 1, converts bytes to a more easily understandable format in kilobytes, megabytes, or gigabytes. Wrapped inside is the pg_total_relation_size() function 2, which reports how many bytes a table, its indexes, and any offline compressed

data takes up on disk. Because the table is empty at this point, running the code in pgAdmin should return a value of 0 bytes, like this:

```
pg_size_pretty
-----
0 bytes
```

You can get the same information using the command line. Launch psql as you learned in Chapter 18. Then, at the prompt, enter the meta-command \dt+ vacuum_test, which should display the following information including table size (I've omitted one column for space):

```
List of relations

Schema | Name | Type | Owner | Persistence |

Size
----
public | vacuum_test | table | postgres | permanent | 0

bytes
```

Again, the current size of the vacuum test table should display 0 bytes.

Checking Table Size After Adding New Data

Let's add some data to the table and then check its size again. We'll use the generate_series() function introduced in Chapter 12 to fill the table's integer_column with 500,000 rows. Run the code in <u>Listing 19-3</u> to do this.

```
INSERT INTO vacuum_test
SELECT * FROM generate_series(1,500000);
```

Listing 19-3: Inserting 500,000 rows into vacuum_test

This standard INSERT INTO statement adds the results of generate_series(), which is a series of values from 1 to 500,000, as rows to the table. After the query completes, rerun the query in <u>Listing 19-2</u> to check the table size. You should see the following output:

```
pg_size_pretty
```

The query reports that the vacuum_test table, now with a single column of 500,000 integers, uses 17MB of disk space.

Checking Table Size After Updates

Now, let's update the data to see how that affects the table size. We'll use the code in <u>Listing 19-4</u> to update every row in the vacuum_test table by adding 1 to the integer_column values, replacing the existing value with a number that's one greater.

```
UPDATE vacuum_test
SET integer_column = integer_column + 1;
```

Listing 19-4: Updating all rows in vacuum_test

Run the code, and then test the table size again.

The table size doubled from 17MB to 35MB! The increase seems excessive, because the update simply replaced existing numbers with values of a similar size. As you might have guessed, the reason for this increase in table size is that for every updated value, PostgreSQL creates a new row, and the dead row remains in the table. Even though you see only 500,000 rows, the table has double that number. This behavior can lead to surprises for database owners who don't monitor disk space.

Before looking at how using VACUUM and VACUUM FULL affects the table's size on disk, let's review the process that runs VACUUM automatically as well as how to check on statistics related to table vacuums.

Monitoring the Autovacuum Process

PostgreSQL's autovacuum process monitors the database and launches VACUUM automatically when it detects a large number of dead rows in a table. Although autovacuum is enabled by default, you can turn it on or off

and configure it using the settings I'll cover later in "Changing Server Settings." Because autovacuum runs in the background, you won't see any immediately visible indication that it's working, but you can check its activity by querying data that PostgreSQL collects about system performance.

PostgreSQL has its own *statistics collector* that tracks database activity and usage. You can look at the statistics by querying one of several views the system provides. (See a complete list of views for monitoring the state of the system in the PostgreSQL documentation under "The Statistics Collector": https://www.postgresql.org/docs/current/monitoring-stats.html.) To check the activity of autovacuum, we query the pg_stat_all_tables view, as shown in Listing 19-5.

```
SELECT 1relname,

2last_vacuum,

3last_autovacuum,

4vacuum_count,

5autovacuum_count

FROM pg_stat_all_tables

WHERE relname = 'vacuum_test';
```

Listing 19-5: Viewing autovacuum statistics for vacuum_test

As you learned in Chapter 17, a view provides the results of a stored query. The query stored by the view pg_stat_all_tables returns a column called relname1, which is the name of the table, plus columns with statistics related to index scans, rows inserted and deleted, and other data. For this query, we're interested in last_vacuum 2 and last_autovacuum 3, which contain the last time the table was vacuumed manually and automatically, respectively. We also ask for vacuum_count 4 and autovacuum_count 5, which show the number of times the vacuum was run manually and automatically.

By default, autovacuum checks tables every minute. So, if a minute has passed since you last updated vacuum_test, you should see details of vacuum activity when you run the query in <u>Listing 19-5</u>. Here's what my

system shows (note that I've removed the seconds from the time to save space here):

The table shows the date and time of the last autovacuum, and the autovacuum_count column shows one occurrence. This result indicates that autovacuum executed a VACUUM command on the table once. However, because we've not vacuumed manually, the last_vacuum column is empty, and the vacuum count is 0.

NOTE

The autovacuum process also runs the Analyze command, which gathers data on the contents of tables. PostgreSQL stores this information and uses it to execute queries efficiently in the future. You can run Analyze manually if needed.

Recall that VACUUM designates dead rows as available for the database to reuse but typically doesn't reduce the size of the table on disk. You can confirm this by rerunning the code in <u>Listing 17-2</u>, which shows the table remains at 35MB even after the automatic vacuum.

Running VACUUM Manually

To run VACUUM manually, you can use the single line of code in <u>Listing 19-6</u>.

```
VACUUM vacuum_test;
```

Listing 19-6: Running VACUUM manually

This command should return the message VACUUM from the server. Now when you fetch statistics again using the query in <u>Listing 17-5</u>, you should

see that the last_vacuum column reflects the date and time of the manual vacuum you just ran, and the number in the vacuum_count column should increase by one.

In this example, we executed VACUUM on our test table, but you can also run VACUUM on the entire database by omitting the table name. In addition, you can add the VERBOSE keyword to return information such as the number of rows found in a table and the number of rows removed, among other information.

Reducing Table Size with VACUUM FULL

Next, we'll run VACUUM with the FULL option, which actually returns the space taken up by dead tuples back to disk. It does this by creating a new version of a table with the dead rows discarded.

To see how VACUUM FULL works, run the command in <u>Listing 19-7</u>.

VACUUM FULL vacuum test;

Listing 19-7: Using vacuum full to reclaim disk space

After the command executes, test the table size again. It should be back down to 17MB, the size it was when we first inserted data.

It's never prudent or safe to run out of disk space, so minding the size of your database files as well as your overall system space is a worthwhile routine to establish. Using VACUUM to prevent database files from growing bigger than they have to is a good start.

Changing Server Settings

You can alter the settings for your PostgreSQL server by editing values in *postgresql.conf*, one of several configuration text files that control server settings. Other files include *pg_hba.conf*, which controls connections to the server, and *pg_ident.conf*, which database administrators can use to map usernames on a network to usernames in PostgreSQL. See the PostgreSQL documentation on these files for details; here we'll just cover *postgresql.conf* because it contains settings you may likely want to change.

Most of the values in the file are set to defaults you may never need to adjust, but it's worth exploring in case you're fine-tuning your system. Let's start with the basics.

Locating and Editing postgresql.conf

The location of *postgresql.conf* varies depending on your operating system and install method. You can run the command in <u>Listing 19-8</u> to locate the file.

```
SHOW config_file;
```

Listing 19-8: Showing the location of postgresql.conf

When I run the command on macOS, it shows the path to the file, as shown here:

```
/Users/anthony/Library/Application Support/Postgres/var-13/postgresql.conf
```

To edit *postgresql.conf*, navigate in your file system to the directory displayed by SHOW config_file; and open the file using a text editor. Don't use a rich-text editor like Microsoft Word, as it may add additional formatting to the file.

NOTE

It's a good idea to save an unaltered copy of postgresql.conf for reference in case you make a change that breaks the system and you need to revert to the original version.

When you open the file, the first several lines should read as follows:

```
# ------
# PostgreSQL configuration file
# -------
#
This file consists of lines of the form:
#
```

```
# name = value
--snip--
```

The *postgresql.conf* file is organized into sections that specify settings for file locations, security, logging of information, and other processes. Many lines begin with a hash mark (#), which indicates the line is commented out and the setting shown is the active default.

For example, in the *postgresql.conf* file section "Autovacuum Parameters," the default is for autovacuum to be turned on (which is a good, standard practice). The hash mark (#) in front of the line means that the line is commented out and the default value is in effect:

To change this or other default settings, you would remove the hash mark, adjust the setting value, and save *postgresql.conf*. Some changes, such as to memory allocations, require a restart of the server; they're noted in *postgresql.conf*. Other changes require only a reload of settings files. You can reload settings files by running the function pg_reload_conf() under an account with superuser permissions or by executing the pg_ctl command, which we'll cover in the next section.

<u>Listing 19-9</u> shows settings you may want to change, excerpted from the *postgresql.conf* section "Client Connection Defaults." Use your text editor to search the file for the following.

```
1 datestyle = 'iso, mdy'
2 timezone = 'America/New_York'
3 default_text_search_config = 'pg_catalog.english'
```

Listing 19-9: Sample postgresql.conf settings

You can use the datestyle setting 1 to specify how PostgreSQL displays dates in query results. This setting takes two parameters separated by a comma: the output format and the ordering of month, day, and year. The

The timezone 2 parameter sets the server time zone. <u>Listing 19-9</u> shows the value America/New_York, which reflects the time zone on my machine when I installed PostgreSQL. Yours should vary based on your location. When setting up PostgreSQL for use as the backend to a database application or on a network, administrators often set this value to UTC and use that as a standard on machines across multiple locations.

The default_text_search_config 3 value sets the language used by the full-text search operations. Here, mine is set to english. Depending on your needs, you can set this to spanish, german, russian, or another language of your choice.

These three examples represent only a handful of settings available for adjustment. Unless you end up deep in system tuning, you probably won't have to tweak much else. Also, use caution when changing settings on a network server used by multiple people or applications; changes can have unintended consequences, so it's worth communicating with colleagues first.

Next, let's look at how to use pg ctl to make changes take effect.

NOTE

The PostgreSQL ALTER SYSTEM command can also be used to update settings. The command creates settings in the file postgresql.auto.conf that will override values in postgresql.conf. See https://www.postgresql.org/docs/current/sql-altersystem.html for details.

Reloading Settings with pg ctl

The command line utility pg_ctl allows you to perform actions on a PostgreSQL server, such as starting and stopping it and checking its status. Here, we'll use the utility to reload the settings files so the changes we make will take effect. Running the command reloads all settings files at once.

You'll need to open and configure a command line prompt the same way you did in Chapter 18 when you learned how to set up and use psql. After you launch a command prompt, use one of the following commands to reload, replacing the path with the path to the PostgreSQL data directory:

On Windows, use pg ctl reload -D "C:\path\to\data\directory\".

On macOS or Linux, use pg_ctl reload -D

To find the location of your PostgreSQL data directory, run the query in *Listing 19-10*.

```
SHOW data_directory;
```

Listing 19-10: Showing the location of the data directory

Place the path after the -D argument, between double quotes on Windows and single quotes on macOS or Linux. You run this command on your system's command prompt, not inside the psql application. Enter the command and press ENTER; it should respond with the message server signaled. The settings files will be reloaded, and changes should take effect.

If you've changed settings that require a server restart, replace reload in *Listing 19-10* with restart.

NOTE

On Windows, you may need to run Command Prompt with administrator privileges to execute pg_ctl statements. Navigate to Command Prompt in your Start menu, right-click, and select **Run as Administrator**.

^{&#}x27;/path/to/data/directory/'.

Backing Up and Restoring Your Database

You might want to back up your entire database either for safekeeping or for transferring data to a new or upgraded server. PostgreSQL offers command line tools that make backup and restore operations easy. The next few sections show examples of how to export data from a database or a single table to a file, as well as how to restore data from an export files.

Using pg_dump to Export a Database or Table

The PostgreSQL command line tool pg_dump creates an output file that contains all the data from your database; SQL commands for re-creating tables, views, functions, and other database objects; and commands for loading the data into tables. You can also use pg_dump to save only selected tables in your database. By default, pg_dump outputs a text file; I'll discuss an alternate custom compressed format first and then discuss other options.

To export the analysis database we've used for our exercises to a file, run the command in *Listing 19-11* at your system's command prompt (not in psql).

```
pg_dump -d analysis -U user_name -Fc -v -f analysis_backup.dump
```

Listing 19-11: Exporting the analysis database with pg dump

Here, we start the command with pg_dump and use similar connection arguments as with psql. We specify the database to export with the -d argument, followed by the -U argument and your username. Next, we use the -Fc argument to specify that we want to generate this export in a custom PostgreSQL compressed format and the -V argument to generate verbose output. Then we use the -f argument to direct the output of pg_dump to a text file named *analysis_backup.dump*. To place the file in a directory other than the one your terminal prompt is currently open to, you can specify the complete directory path before the filename.

When you execute the command, depending on your installation, you might see a password prompt. Fill in that password, if prompted. Then, depending on the size of your database, the command could take a few

minutes to complete. You'll see a series of messages about the objects the command is reading and outputting. When it's done, it should return you to a new command prompt, and you should see a file named *analysis_backup.dump* in your current directory.

To limit the export to one or more tables that match a particular name, use the -t argument followed by the name of the table in single quotes. For example, to back up just the train_rides table, use the following command:

```
pg_dump -t 'train_rides' -d analysis -U user_name -Fc -v -f train_backup.dump
```

Now let's look at how to restore the data from the export file, and then we'll explore additional pg dump options.

Restoring a Database Export with pg_restore

The pg_restore utility restores data from your exported database file. You might need to restore your database when migrating data to a new server or when upgrading to a new major version of PostgreSQL. To restore the analysis database (assuming you're on a server where analysis doesn't exist), at the command prompt, run the command in <u>Listing 19-12</u>.

```
pg_restore -C -v -d postgres -U user_name analysis_backup.dump
```

Listing 19-12: Restoring the analysis database with pg_restore

After pg_restore, you add the -c argument, which tells the utility to create the analysis database on the server. (It gets the database name from the export file.) Then, as you saw previously, the -v argument provides verbose output, and -d specifies the name of the database to connect to, followed by the -u argument and your username. Press ENTER, and the restore will begin. When it's done, you should be able to view your restored database via psql or in pgAdmin.

Exploring Additional Backup and Restore Options

You can configure pg_dump with multiple options to include or exclude certain database objects, such as tables matching a name pattern, or to specify the output format. For example, when we backed up the analysis database, we specified the -Fc argument with pg_dump to generate the backup in a custom PostgreSQL compressed format. By excluding the -Fc argument, the utility will output in plain text, and you can view the contents of the backup with a text editor. For details, check the full pg_dump documentation at https://www.postgresql.org/docs/current/app-pgdump.html. For corresponding restore options, check the pg_restore documentation at https://www.postgresql.org/docs/current/app-pgrestore.html.

You also may want to explore the pg_basebackup command, which can back up multiple databases running on a PostgreSQL server. See https://www.postgresql.org/docs/current/app-pgbasebackup.html for details. An even more robust backup solution is pgBackRest (https://pgbackrest.org/), a free, open source application with options such as cloud integration for storage and the ability to create full, incremental, or differential backups.

Wrapping Up

In this chapter, you learned how to track and conserve space in your databases using the VACUUM feature in PostgreSQL. You also learned how to change system settings as well as back up and restore databases using other command line tools. You may not need to perform these tasks every day, but the maintenance tricks you learned here can help enhance the performance of your databases. Note that this is not a comprehensive overview of the topic; see the appendix for more resources on database maintenance.

In the next and final chapter of this book, I'll share guidelines for identifying hidden trends and telling an effective story using your data.

TRY IT YOURSELF

Using the techniques you learned in this chapter and earlier in the book, create a database and add a small table and some data. Then back up the database, delete it, and restore it using pg_{dump} and $pg_{restore}$.

If you make your backup using the default text format instead of compressed, you can use a text editor to explore the file created by pg_{dump} to examine how it organizes the statements to create objects and insert data.

20 TELLING YOUR DATA'S STORY



Learning SQL can be fun in and of itself, but it serves a greater purpose: it helps unearth the stories in your data. As you've learned, SQL gives you the tools to find interesting trends, insights,

or anomalies in your data and then make smart decisions based on what you've learned. But how do you identify these trends from just a collection of rows and columns? And how can you glean meaningful insights from these trends after identifying them?

In this chapter, I outline a process I've used as a journalist and product developer to discover stories in data and communicate my findings. I'll start with how to generate ideas by asking good questions and gathering and exploring data. Then I explain the analysis process, which culminates in presenting your findings clearly. Identifying trends in your dataset and creating a narrative of your findings sometimes requires considerable experimentation and enough fortitude to weather the occasional dead end. Regard these tips as less of a checklist and more of a guideline to help ensure a thorough analysis that minimizes mistakes.

Start with a Question

Curiosity, intuition, or sometimes just dumb luck can often spark ideas for data analysis. If you're a keen observer of your surroundings, you might notice changes in your community over time and wonder if you can measure that change. Consider your local real estate market. If you see "For Sale" signs popping up around town more than usual, you might start asking questions. Is there a dramatic increase in home sales this year compared with last year? If so, by how much? Which neighborhoods are riding the wave? These questions create a great opportunity for data analysis. If you're a journalist, you might find a story. If you run a business, you might see a marketing opportunity.

Likewise, if you surmise that a trend is occurring in your industry, confirming it might provide you with a business opportunity. For example, if you suspect that sales of a particular product are sluggish, you can analyze data to confirm the hunch and adjust inventory or marketing efforts appropriately.

Keep track of these ideas and prioritize them according to their potential value. Analyzing data to satisfy your curiosity is perfectly fine, but if the answers can make your institution more effective or your company more profitable, that's a sign they're worth pursuing.

Document Your Process

Before you delve into analysis, consider how to make your process transparent and reproducible. For the sake of credibility, others in your organization as well as those outside it should be able to reproduce your work. In addition, make sure you document enough of your process so that if you set the project aside for several weeks, you won't have trouble getting up to speed when you return to it.

There isn't one right way to document your work. Taking notes on research or creating step-by-step SQL queries that another person could follow to replicate your data import, cleaning, and analysis can make it easier for others to verify your findings. Some analysts store notes and code in a text file. Others use version control systems, such as GitHub, or work

in code notebooks. What's important is you create a system of documentation and use it consistently.

Gather Your Data

After you've hatched an idea for analysis, the next step is to find data that relates to the trend or question. If you're working in an organization that already has its own data on the topic, lucky you—you're set! In that case, you might be able to tap internal marketing or sales databases, customer relationship management (CRM) systems, or subscriber or event registration data. But if your topic encompasses broader issues involving demographics, the economy, or industry-specific subjects, you'll need to do some digging.

A good place to start is to ask experts about the sources they use. Analysts, government decision-makers, and academics can point you to available data and describe its usefulness. Federal, state, and local governments, as you've seen throughout the book, produce volumes of data on all kinds of topics. In the United States, check out the federal government's data catalog site at https://www.data.gov/ or individual federal agency sites, such as the National Center for Education Statistics (NCES) at https://www.bls.gov/.

You can also browse local government websites. Any time you see a form for users to fill out or a report formatted in rows and columns, those are signs that structured data might be available for analysis. All is not lost if you have access only to unstructured data, though—as you learned in Chapter 14, you can even mine unstructured data, such as text files, for analysis.

If the data you want to analyze was collected over multiple years, I recommend examining five or ten years or more, instead of just one or two, if possible. Analyzing a snapshot of data collected over a month or a year can yield interesting results, but many trends play out over a longer period of time and may not be evident if you look at a single year of data. I'll discuss this further in the section "Identify Key Indicators and Trends over Time."

No Data? Build Your Own Database

Sometimes, no one has the data you need in a format you can use. If you have time, patience, and a methodology, you might be able to build your own dataset. That is what my *USA Today* colleague Robert Davis and I did when we wanted to study issues related to the deaths of college students on campuses in the United States. Not a single organization—not the schools or state or federal officials—could tell us how many college students were dying each year from accidents, overdoses, or illnesses on campus. We decided to collect our own data and structure the information into tables in a database.

We started by researching news articles, police reports, and lawsuits related to student deaths. After finding reports of more than 600 student deaths from 2000 to 2005, we followed up with interviews with education experts, police, school officials, and parents. From each report, we cataloged details such as each student's age, school, cause of death, year in school, and whether drugs or alcohol played a role. Our findings led to the publication of the article "In College, First Year Is by Far the Riskiest" in *USA Today* in 2006. The story featured the key finding from the analysis of our SQL database: freshmen were particularly vulnerable and accounted for the highest percentage of the student deaths we studied.

You too can create a database if you lack the data you need. The key is to identify the pieces of information that matter and then systematically collect them.

Assess the Data's Origins

After you've identified a dataset, find as much information about its origins and maintenance methods as you can. Governments and institutions gather data in all sorts of ways, and some methods produce data that is more credible and standardized than others.

For example, you've already seen that US Department of Agriculture (USDA) food producer data included the same company names spelled in multiple ways. It's worth knowing why. (Perhaps the data is manually copied from a written form to a computer.) Similarly, the New York City

taxi data you analyzed in Chapter 12 records the start and end times of each trip. This begs the question of when the timer starts and stops—when the passenger gets in and out of the vehicle, or is there some other trigger? You should know these details not only to draw better conclusions from analysis but also to pass them along to others who might be interpreting your analysis.

The origins of a dataset might also affect how you analyze the data and report your findings. For example, with US Census Bureau data, it's important to know that the decennial census conducted every 10 years is a complete count of the population, whereas the American Community Survey (ACS) is drawn from only a sample of households. As a result, ACS counts have a margin of error, but the decennial census doesn't. It would be irresponsible to report on the ACS without considering that the margin of error could render differences between numbers insignificant.

Interview the Data with Queries

Once you have your data, understand its origins, and have it loaded into your database, you can explore it with queries. Throughout the book, I call this step *interviewing data*, which is what you should do to find out more about the contents of your data and whether they contain any red flags.

A good place to start is with aggregates. Counts, sums, sorting, and grouping by column values should reveal minimum and maximum values, potential issues with duplicate entries, and a sense of the general scope of your data. If your database contains multiple, related tables, try joins to make sure you understand how the tables relate. Using LEFT JOIN and RIGHT JOIN, as you learned in Chapter 7, should show whether key values from one table are missing in another. That may or may not be a concern, but at least you'll be able to identify potential problems to address. Jot down a list of questions or concerns you have, and then move on to the next step.

Consult the Data's Owner

After exploring your database and forming early conclusions about the quality and trends you observed, take time to bring questions or concerns to a person who knows the data well. That person could work at the government agency or firm that gave you the data, or the person might be an analyst who has worked with the data before. This step is your chance to clarify your understanding of the data, verify initial findings, and discover whether the data has any issues that make it unsuitable for your needs.

For example, if you're querying a table and notice values in columns that seem to be gross outliers (such as dates in the future for events that were supposed to have happened in the past), you should ask about that discrepancy. If you expect to find someone's name in a table (perhaps even your own name) and it's not there, that should prompt another question. Is it possible you don't have the whole dataset, or is there a problem with data collection?

The goal is to get expert help to do the following:

Understand the limits of the data. Make sure you know what the data includes, what it excludes, and any caveats about content that might affect how you perform your analysis.

Make sure you have a complete dataset. Verify that you have all the records you should expect to see and that if any data is missing, you understand why.

Determine whether the dataset suits your needs. Consider looking elsewhere for more reliable data if your source acknowledges problems with the data's quality.

Every dataset and situation is unique, but consulting another user or owner of the data can help you avoid unnecessary missteps.

Identify Key Indicators and Trends over Time

When you're satisfied that you understand the data and are confident in its trustworthiness, completeness, and appropriateness to your analysis, the next step is to run queries to identify key indicators and, if possible, trends over time.

Your goal is to unearth data that you can summarize in a sentence or present as a slide in a presentation. An example of a finding would be something like this: "After five years of declines, the number of people enrolling in Widget University has increased by 5 percent for two consecutive semesters."

To identify this type of trend, you'll follow a two-step process:

Choose an indicator to track. In census data, it might be the percentage of the population that is over age 60. Or in the New York City taxi data, it could be the median number of weekday trips over the span of one year.

Track that indicator over multiple years to see how it has changed, if at all.

In fact, these are the steps we used in Chapter 7 to apply percent change calculations to multiple years of census data contained in joined tables. In that case, we looked at the change in population in counties between 2010 and 2019. The population estimate was the key indicator, and the percent change showed the trend over the nine-year span for each county.

One caveat about measuring change over time: even when you see a dramatic change between any two years, it's worth digging into as many years' worth of data as possible to understand the shorter-term change in the context of a long-term trend. Any year-to-year change might seem dramatic, but seeing it in context of multiyear activity can help you assess its true significance.

For example, the US National Center for Health Statistics releases data on the number of babies born each year. As a data nerd, this is one of the indicators I like to keep tabs on, because births often reflect broader trends in culture or the economy. *Figure 20-1* shows the annual number of births from 1910 to 2020.



Figure 20-1: US births from 1910 to 2020. Source: US National Center for Health Statistics

Looking at only the last five years of this graph (shaded in gray), we see that the number of births has declined steadily, to 3.61 million in 2020 from 3.95 million in 2016. The recent drops are indeed noteworthy (reflecting continuing decreases in birth rates and an aging population). But in the long-term context, we see that the nation has experienced several baby booms and busts in the past 100 years. One example you can see in *Figure* 20-1 is the major rise in the mid-1940s following World War II, which signaled the start of the Baby Boom generation.

By identifying key indicators and looking at change over time, both short term and long term, you might uncover one or more findings worth presenting to others or acting on.

NOTE

Any time you work with data from a survey, poll, or other sample, it's important to test for statistical significance. Are the results actually a trend or just the result of chance? Significance testing is a statistical concept beyond the scope of this book but one that data analysts should know. See the appendix for PostgreSQL resources for advanced statistics.

Ask Why

Data analysis can tell you what happened, but it doesn't always indicate why something happened. To learn the *why*, it's worth revisiting the data with experts in the topic or the owners of the data. In the US births data, it's easy to calculate year-to-year percent change from those numbers. But the data doesn't tell us why births steadily increased from the early 1980s to 1990. For that information, you could consult a demographer who would most likely explain that the rise in births during those years coincided with more Baby Boomers entering their child-bearing years.

As you share your findings and methodology with experts, ask them to note anything that seems unlikely or worthy of further examination. For the findings that they can corroborate, ask them to help you understand the forces behind those findings. If they're willing to be cited, you can use their comments to supplement your report or presentation. Quoting experts' insights about trends in this way is a standard approach journalists use.

Communicate Your Findings

How you share the results of your analysis depends on your role. A student might present their results in a paper or dissertation. A person who works in a corporate setting might present their findings using PowerPoint, Keynote, or Google Slides. A journalist might write a story or produce a data visualization. Regardless of the end product, here are tips for presenting the information well, using a fictional home sales analysis as an example:

Identify an overarching theme based on your findings. Make the theme the title of your presentation, paper, or visualization. For example, you might title a presentation on real estate "Home Sales Rise in Suburban Neighborhoods, Fall in Cities."

Present overall numbers to show the general trend. Highlight the key findings from your analysis. For example, "All suburban neighborhoods saw sales rise 5 percent each of the last two years, reversing three years of declines. Meanwhile, city neighborhoods saw a 2 percent decline."

Highlight specific examples that support the trend. Describe one or two relevant cases. For example, "In Smithtown, home sales increased 15 percent following the relocation of XYZ Corporation's headquarters last year."

Acknowledge examples counter to the overall trend. Use one or two relevant cases here as well. For example, "Two city neighborhoods did show growth in home sales: Arvis (up 4.5%) and Zuma (up 3%)."

Stick to the facts. Never distort or exaggerate any findings.

Provide expert insights. Use quotes or citations.

Visualize numbers using bar charts. line charts, or maps. Tables are helpful for giving your audience specific numbers, but it's easier to understand trends from a visualization.

Cite the source of the data and what your analysis includes or omits. Provide dates covered, the name of the provider, and any distinctions that affect the analysis, for example, "Based on Walton County tax filings in 2022 and 2023. Excludes commercial properties."

Share your data. Post data online for download, including a description of the steps you took to analyze it. Nothing says transparency more than sharing your data with others so they can perform their own analysis and corroborate your findings.

Generally, a short presentation that communicates your findings clearly and succinctly, and then invites dialogue from your audience, works best. Of course, you can follow your own preferred pattern for working with data and presenting your conclusions. But over the years, these steps have helped me avoid data errors and mistaken assumptions.

Wrapping Up

At last, you've reached the end of our practical exploration of SQL! Thank you for reading this book, and I welcome your suggestions and feedback via email at practicalsqlbook@gmail.com. At the end of this book is an appendix that lists additional PostgreSQL-related tools you might want to try.

I hope you've come away with data analysis skills you can start using immediately on the everyday data you encounter. More importantly, I hope you've seen that each dataset has a story, or several stories, to tell. Identifying and telling these stories is what makes working with data worthwhile; it's more than just combing through a collection of rows and columns. I look forward to hearing about what you discover!

TRY IT YOURSELF

It's your turn to find and tell a story using the SQL techniques we've covered. Using the process outlined in this chapter, consider a local or national topic and search for available data. Assess its quality, the questions it might answer, and its timeliness. Consult with an expert who knows the data and the topic well. Load the data into PostgreSQL and interview it using aggregate queries and filters. What trends can you discover? Summarize your findings in a short presentation.

APPENDIX ADDITIONAL POSTGRESQL RESOURCES

This appendix contains resources to help you stay informed about PostgreSQL developments, find additional software, and get help. Because software resources are likely to

change, I'll maintain a copy of this appendix at the GitHub repository that contains all the book's resources. You can find a link to GitHub via https://nostarch.com/practical-sql-2nd-edition/.

PostgreSQL Development Environments

Throughout the book, we've used the graphical user interface pgAdmin to connect to PostgreSQL, run queries, and view database objects. Although pgAdmin is free, open source, and popular, it's not your only choice for working with PostgreSQL. The wiki entry "PostgreSQL Clients" at https://wiki.postgresql.org/wiki/PostgreSQL_Clients catalogs many alternatives

The following list shows several tools I've tried, including free and paid options. The free tools work well for general analysis work. If you wade

deeper into database development, you might want to upgrade to the paid options, which typically offer advanced features and support.

Beekeeper Studio Free and open source GUI for PostgreSQL, MySQL, Microsoft SQL Server, SQLite, and other platforms. Beekeeper works on Windows, macOS, and Linux and features one of the more refined app designs among database GUIs (see https://www.beekeeperstudio.io/).

DBeaver Described as a "universal database tool" that works with PostgreSQL, MySQL, and many other databases, DBeaver includes a visual query builder, code autocompletion, and other advanced features. There are paid and free versions for Windows, macOS, and Linux (see https://dbeaver.com/).

DataGrip A SQL development environment that offers code completion, bug detection, and suggestions for streamlining code, among many other features. It's a paid product, but the company, JetBrains, offers discounts and free versions for students, educators, and nonprofits (see https://www.jetbrains.com/datagrip/).

Navicat A richly featured SQL development environment with versions that support PostgreSQL as well as other databases, including MySQL, Oracle, MongoDB, and Microsoft SQL Server. There is no free version of Navicat, but the company offers a 14-day free trial (see https://www.navicat.com/).

Postbird A simple cross-platform PostgreSQL GUI for writing queries and viewing objects. Free and open source (see https://github.com/Paxa/postbird/).

Postico A macOS-only client from the maker of Postgres.app that takes its cues from Apple design. The full version is paid, but a restricted-feature version is available with no time limit (see https://eggerapps.at/postico/).

A trial version can help you decide whether the product is right for you.

PostgreSQL Utilities, Tools, and Extensions

You can expand the capabilities of PostgreSQL via numerous third-party utilities, tools, and extensions. These range from additional backup and

import/export options to improved formatting for the command line to powerful statistics packages. You'll find a curated list online at https://github.com/dhamaniasad/awesome-postgres/, but here are several to highlight:

Devart Excel Add-in for PostgreSQL An Excel add-in that lets you load and edit data from PostgreSQL directly in Excel workbooks (see https://www.devart.com/excel-addins/postgresql.html).

MADlib A machine learning and analytics library for large data sets that integrates with PostgreSQL (see https://madlib.apache.org/).

pgAgent A job manager that lets you run queries at scheduled times, among other tasks (see

https://www.pgadmin.org/docs/pgadmin4/latest/pgagent.html).

pgBackRest An advanced database backup and restore management tool (see https://pgbackrest.org/).

pgcli A substitute command-line interface for psql that includes autocompletion and syntax highlighting (see https://github.com/dbcli/pgcli/).

pgRouting Enables a PostGIS-enabled PostgreSQL database to perform network analysis tasks, such as finding driving distance along roadways (see https://pgrouting.org/).

PL/R A loadable procedural language that provides the ability to use the R statistical programming language within PostgreSQL functions and triggers (see https://www.joeconway.com/plr.html).

pspg Formats the output of psql into sortable, scrollable tables with support for several color themes (see https://github.com/okbob/pspg/).

PostgreSQL News and Community

Now that you're a bona fide PostgreSQL user, it's wise to stay on top of community news. The PostgreSQL development team updates the software on a regular basis, and changes might affect code you've written or tools you're using. You might even find new opportunities for analysis.

Here's a collection of online resources to help you stay informed:

Crunchy Data blog Posts from the team at Crunchy Data, which provides enterprise PostgreSQL support and solutions (see https://blog.crunchydata.com/blog/).

The EDB Blog Posts from the team at EDB, a PostgreSQL services company that provides the Windows installer referenced in this book and also leads development of pgAdmin (see https://www.enterprisedb.com/blog/).

Planet PostgreSQL Aggregates blog posts and announcements from the database community (see https://planet.postgresql.org/).

Postgres Weekly An email newsletter that rounds up announcements, blog posts, and product announcements (see https://postgresweekly.com/).

PostgreSQL mailing lists These lists are useful for asking questions of community experts. The pgsql-novice and pgsql-general lists are particularly good for beginners, although note that email volume can be heavy (see https://www.postgresql.org/list/).

PostgreSQL news archive Official news from the PostgreSQL team (see https://www.postgresql.org/about/newsarchive/).

PostgreSQL nonprofits PostgreSQL-related charitable organizations include the United States PostgreSQL Association and PostgreSQL Europe. Both provide education, events, and advocacy around the product (see https://postgresql.us/ and https://www.postgresql.eu/).

PostgreSQL user groups A list of community groups that offer meetups and other activities (see https://www.postgresql.org/community/user-groups/).

PostGIS blog Announcements and updates about the PostGIS extension (see https://postgis.net/blog/).

Additionally, I recommend paying attention to developer notes for any of the PostgreSQL-related software you use, such as pgAdmin.

Documentation

Throughout this book, I've made frequent reference to pages in the official PostgreSQL documentation. You can find documentation for each version

of the software along with an FAQ and wiki on the main page at https://www.postgresql.org/docs/. It's worth reading sections of the manual as you learn more about a topic, such as indexes, or search for all the options that come with functions. In particular, the "Preface," "Tutorial," and "SQL Language" sections cover much of the material presented in the book's chapters.

Other good resources for documentation are the Postgres Guide at http://postgresguide.com/ and Stack Overflow, where you can find questions and answers posted by developers at https://stackoverflow.com/questions/tagged/postgresql/. You can also check out the Q&A site for PostGIS at https://gis.stackexchange.com/questions/tagged/postgis/.

Index

Please note that index links to approximate location of each term.

Symbols

```
+ (addition operator), <u>79</u>
& (ampersand operator), <u>270</u>
:= (assignment operator), <u>359</u>
* (asterisk)
  as multiplication operator, <u>79</u>
  as wildcard in SELECT statement, 30
\ (backslash), <u>249</u>
  escaping characters with, <u>255</u>
, (comma), <u>60</u>
|\cdot| (cube root operator), <u>81</u>
{} (curly brackets), <u>249</u>
  denoting an array in query output, <u>90</u>
<-> (distance operator), <u>271</u>
@@ (double at sign match operator), <u>266</u>
:: (double-colon CAST operator), <u>56</u>
$$ (double-dollar quoting), 351
11 (double-pipe concatenation operator), <u>172</u>, <u>261</u>, <u>329</u>
```

```
" (double quote), <u>61</u>, <u>118</u>
! (exclamation point)
  as factorial operator, <u>81</u>
  as negation, <u>250</u>, <u>270</u>
^ (exponentiation operator), <u>80</u>
/ (forward slash)
  as division operator, <u>80</u>
  in macOS file paths, 44
> (greater-than comparison operator), <u>35</u>
>= (greater-than or equals comparison operator), <u>35</u>
- (hyphen subtraction operator), <u>79</u>, <u>331</u>
@> and <@ (JSON containment operators), 315
? and ? | (JSON existence operators), 315
-> and - (JSON field and element extraction operators), <u>310</u>, <u>310</u>–<u>311</u>
#- (JSON path deletion operator), <u>331</u>
#> and ##> (JSON path extraction operators), 310, 314
< (less-than comparison operator), <u>35</u>
<= (less-than or equals comparison operator), <u>35</u>
<> (not-equal comparison operator), <u>35</u>
!= (not-equal comparison operator), <u>35</u>
() (parentheses)
  to designate order of operations, <u>38</u>
  to specify columns for importing, <u>70</u>
% (percent sign)
  as modulo operator, <u>80</u>
  wildcard for pattern matching, <u>37</u>
```

```
| (pipe character)
      as delimiter, <u>44</u>, <u>63</u>, <u>72</u>
      to redirect output, <u>295</u>
   ; (semicolon), <u>19</u>
   // (square root operator), <u>81</u>
   ~* (tilde-asterisk case-insensitive matching operator), <u>250</u>
   ~ (tilde case-sensitive matching operator), <u>250</u>
   _ (underscore wildcard for pattern matching), <u>37</u>
Α
   adding numbers, <u>79</u>
      across columns, <u>82</u>
   addition operator (+), <u>79</u>
   aggregate functions, <u>86</u>, <u>142</u>
      avg(), 86, 200
      binary (two-input), <u>186</u>
      count(), <u>143</u>, <u>159</u>
      filtering with HAVING, <u>153</u>
      GROUP BY requirement, <u>146</u>
      interviewing data, <u>159</u>
      max(), <u>145</u>
      min(), 145
      PostgreSQL documentation, <u>143</u>
      sum(), 86, 149
   aliases for table names, <u>107</u>, <u>151</u>
   ALTER COLUMN statement, <u>133</u>
```

```
ALTER SYSTEM command, 394
ALTER TABLE statement, <u>165</u>
   ADD COLUMN, <u>165</u>, <u>169</u>, <u>286</u>
   ADD CONSTRAINT, 133
   ALTER COLUMN, <u>165</u>
   DROP COLUMN, <u>165</u>, <u>176</u>
   RENAME TO, <u>180</u>
   to restart sequence, <u>127</u>
   table constraints, adding and removing, <u>132</u>
American National Standards Institute (ANSI), <u>305</u>
   SQL standard, xxiv
ampersand operator (\&), <u>270</u>
Amtrak trip data, <u>218</u>
ANALYZE keyword
   with EXPLAIN statement, <u>135</u>
   with vacuum, 391
AND logical operator combining comparison operators, <u>38</u>, <u>114</u>
antimeridian, <u>66</u>
API (application programming interface), 318
array, <u>90</u>, <u>256</u>
   array_length() function, <u>252</u>
   constructor example, <u>90</u>
   denoted by curly brackets in query output, 90, 256
   extracting element with JSON operators, <u>312</u>
   functions, <u>91</u>
   index positions, <u>313</u>
```

```
in JSON, <u>306</u>, <u>332</u>
   notation in query, <u>260</u>
   passing into ST MakePoint(), 284
   returned from regexp match(), 255
   unnest() function, 91
array length() function, 252
ASC keyword in ORDER BY clause, 32
As keyword
   declaring table aliases with, <u>107</u>, <u>113</u>
   renaming columns in query results with, <u>82</u>, <u>106</u>
assignment operator (:=), <u>359</u>
asterisk (*)
   as multiplication operator, <u>79</u>
   as wildcard in SELECT statement, <u>30</u>
attribute, <u>22</u>
auto-incrementing integers, 23, 31, 46
   gaps in sequence, <u>47</u>, <u>126</u>
   identity column SQL standard, 46
   overriding values, <u>127</u>
   restarting sequence, <u>127</u>
   as surrogate primary key, <u>125</u>
   using identity, <u>46</u>, <u>122</u>, <u>125</u>
autovacuum, 390
   editing server setting, <u>393</u>
   time of last vacuum, 391
avg() function, <u>86</u>, <u>200</u>, <u>226</u>
```

```
В
```

C

```
backslash (\setminus), <u>249</u>
   escaping characters with, <u>255</u>
backups
   column, <u>168</u>
   improving performance when updating tables, <u>179</u>
   restoring values from another table, <u>170</u>
   tables, <u>167</u>
bell curve. See normal distribution
BETWEEN comparison operator, <u>35</u>, <u>229</u>
   inclusive property, <u>36</u>
BINARY file format, <u>63</u>
birth data, US, 404
Boolean expression
   in constraint, <u>131</u>
  in table join, <u>94</u>
Boolean value, <u>94</u>
   used in table join, <u>94</u>
B-tree index, <u>134</u>
Bureau of Labor Statistics, 401
CALL command, <u>352</u>
camel case, <u>27</u>, <u>118</u>
carriage return in text files, 63
Cartesian product as result of cross join, <u>103</u>
```

```
CASCADE keyword, <u>129</u>
case sensitivity
   with ILIKE operator, <u>37</u>
   with LIKE operator, <u>37</u>
CASE statement, <u>241</u>
   in common table expression, <u>242</u>
   ELSE clause, <u>242</u>
   syntax, <u>241</u>
   with trigger, <u>358</u>
   in update statement, <u>262</u>
   when clause, <u>241</u>, <u>359</u>
CAST() function, <u>55</u>
   shortcut notation, <u>56</u>
categorizing data, <u>241</u>
char, <u>42</u>
character string types, <u>42</u>
   char, <u>42</u>
   functional difference from number types, <u>45</u>
   performance in PostgreSQL, 43
   text, <u>42</u>
   varchar, 42
char length() function, 246
CHECK constraint, <u>130</u>
classify max temp() user function, 358
clock timestamp() function, 208
Codd, Edgar F., xxiv, 93
```

```
codes, distinguishing from numbers, 65
column, 22
   adding numbers in, <u>86</u>
   alias, <u>82</u>
   alter data type, <u>165</u>
   avoiding spaces in name, <u>119</u>
   deleting, <u>176</u>
   indexes, <u>136</u>
   populating new during backup, <u>179</u>
   retrieving in queries, <u>31</u>
   updating values, <u>166</u>
comma (,), <u>60</u>
command line, <u>363</u>
   advantages of using, 364
   createdb command, 383
   psql, <u>370</u>
   setup, <u>364</u>
     macOS, <u>368</u>
      PATH environment variable, <u>364</u>
      Windows, <u>364</u>
   shell programs, <u>368</u>
COMMIT statement in transaction block, <u>177</u>
common table expression (CTE), <u>234</u>
   with CASE statement, <u>242</u>
  defining, 234
comparison operators, 35
```

```
combining with and and or, <u>38</u>
composite primary key, <u>121</u>
concatenation, <u>172</u>
conditional expression, <u>241</u>
constraints, <u>23</u>, <u>120</u>
   adding and removing, <u>132</u>
   CHECK, <u>130</u>, <u>185</u>
   column vs. table, <u>121</u>, <u>123</u>
   CONSTRAINT keyword, <u>95</u>, <u>123</u>, <u>130</u>
   foreign key, <u>128</u>
   NOT NULL, <u>132</u>
   primary key, <u>95</u>, <u>121</u>, <u>123</u>
   UNIQUE, <u>96</u>, <u>131</u>
   violations when altering table, <u>166</u>
constructor, <u>90</u>
Coordinated Universal Time (UTC), <u>52</u>, <u>206</u>
   UTC offset, <u>52</u>, <u>206</u>, <u>219</u>
COPY statement
   DELIMITER option, <u>63</u>
   description of, <u>59</u>
   exporting data, <u>43</u>, <u>72</u>
   FORMAT option, <u>63</u>
   FROM keyword, <u>62</u>
   HEADER option, 63
   importing data, <u>62</u>
   JSON import, <u>310</u>
```

```
naming file paths, <u>44</u>
   QUOTE option, 63
   specifying columns to import, <u>68</u>
   specifying file formats, <u>63</u>
   specifying rows to import, <u>70</u>
   то keyword, <u>72</u>, <u>216</u>
   where clause, <u>70</u>
   with keyword, <u>62</u>
corr() function, <u>186</u>
   correlation does not imply causality, <u>189</u>, <u>192</u>
   interpreting correlation coefficients, <u>186</u>
correlated subquery, 224
count () function, <u>143</u>, <u>159</u>, <u>227</u>
   distinct values, 144
   with group by, <u>147</u>
   on multiple columns, <u>148</u>
   values present in a column, <u>144</u>
counting
   distinct values, <u>144</u>
  missing values displayed, 161
  rows, <u>143</u>
   using pgAdmin, <u>144</u>
CREATE DATABASE statement, 19
createdb utility, <u>383</u>
CREATE EXTENSION statement, 237, 276, 352
CREATE FUNCTION statement, <u>347</u>
```

```
CREATE INDEX statement, <u>134</u>, <u>136</u>
  CREATE TABLE statement, 22
     backing up a table with, <u>167</u>
     declaring data types, 41
     temporary table, <u>71</u>
  CREATE TRIGGER statement, 356
  CREATE VIEW statement, 339
  cross join keyword, <u>103</u>, <u>236</u>
  crosstab() function, <u>240</u>
     syntax example, <u>239</u>
  cross tabulations, <u>236</u>
     installing the tablefunc module, 237
  CSV (comma-separated values), <u>60</u>
     export using COPY, 72
     header row, <u>61</u>
     opening with text editor, 2
  cube root operator (++/), <u>81</u>
  curly brackets (\{\}), <u>249</u>
     denoting an array in query output, <u>90</u>
  current_date function, 208
  current time function, <u>208</u>
  current timestamp function, 208
  cut points, <u>88</u>
D
  data
```

```
structured and unstructured, <u>245</u>
   telling its story, <u>399</u>
database
   backup and restore, <u>395</u>
   connecting to, <u>20</u>, <u>22</u>
   create from command line, 383
   creating, <u>17</u>, <u>19</u>
   maintenance, <u>387</u>
database management system, <u>12</u>, <u>19</u>
database server, <u>12</u>, <u>19</u>
data dictionary, 41
data types, 41
  bigint, 45
   bigserial, <u>23</u>, <u>45</u>, <u>46</u>
   boolean, 55
   char, <u>42</u>
   character string types, <u>42</u>
   date, <u>22</u>, <u>51</u>
   date and time types, <u>51</u>
   decimal, 47
   declaring with CREATE TABLE, 41
   double precision, 48
   full-text search, <u>265</u>
   geography, <u>280</u>
   geometry, 281
   importance of using appropriate type, <u>41</u>
```

```
integer, 45
   interval, <u>51</u>
   json, <u>54</u>
   jsonb, <u>54</u>
   modifying with ALTER COLUMN, 165
   number types, 44
   numeric, <u>23</u>, <u>47</u>
   real, <u>48</u>
   returned by math operations, <u>78</u>
   serial, <u>31</u>, <u>45</u>, <u>46</u>
   serial types, <u>46</u>
   smallint, 45
   smallserial, 45, 46
   text, <u>42</u>
   time, <u>51</u>
   timestamp, <u>51</u>, <u>204</u>
   transforming values with CAST(), 55
   tsquery, <u>266</u>
   tsvector, 265
   varchar, <u>23</u>, <u>42</u>
date data types
   date, <u>51</u>
   interval, <u>51</u>
date_part() function, <u>205</u>, <u>215</u>, <u>241</u>
dates
   calculations with, <u>212</u>
```

```
input format, 22, 25, 36, 52, 204, 205
  matching with regular expressions, <u>253</u>
  setting default style, <u>394</u>
Davis, Robert, 401
daylight saving time, <u>210</u>
deciles, <u>90</u>
decimal data types, 47
decimal degrees, <u>66</u>
DELETE CASCADE statement with foreign key constraint, <u>129</u>
DELETE statement, 70
  removing rows matching criteria, <u>175</u>
  with subquery, <u>225</u>
delimited text files, <u>59</u>
  text qualifiers, <u>61</u>
delimiter, comma as most common, <u>60</u>
DELIMITER keyword with COPY statement, 63
dense rank() function, 193
derived table, <u>225</u>
  joining, <u>226</u>
DESC keyword in ORDER BY clause, 32
dirty data, 29, 157
  cleaning, <u>157</u>
  foreign keys help to avoid, <u>129</u>
  when to discard, <u>165</u>
distance operator (<->), <u>271</u>
DISTINCT keyword, 33
```

```
with count (), <u>144</u>
      in is distinct from clause, <u>169</u>
      on multiple columns, <u>34</u>
   division, 79
      finding the remainder, <u>80</u>
      integer vs. decimal, <u>79</u>, <u>80</u>
   documenting code, <u>41</u>
   double at sign match operator (@@), <u>266</u>
   double-colon CAST operator (::), <u>56</u>
   double-dollar quoting ($$), 351
   double-pipe concatenation operator (++), <u>172</u>, <u>261</u>, <u>329</u>
   double quote ("), <u>61</u>, <u>118</u>
   DROP statement
      COLUMN, <u>176</u>
      INDEX, <u>137</u>
      TABLE, <u>71</u>, <u>176</u>
   duplicate data created by spelling variations, <u>160</u>
Ε
   Eastern Standard Time (EST), <u>52</u>
   eliminating duplicate values in query, <u>34</u>
   ELSE clause in CASE statement, 242
   entity, <u>19</u>
   environment variables, <u>364</u>
   epoch, <u>206</u>, <u>320</u>
   equals comparison operator (=), 35
```

```
error messages
   CSV import failure, <u>67</u>, <u>69</u>
   foreign key violation, <u>129</u>
   out of range, 46
   primary key violation, <u>124</u>
   relation already exists, <u>119</u>
   UNIQUE constraint violation, <u>132</u>
   when using CAST(), 56
escaping characters, <u>255</u>
EST (Eastern Standard Time), <u>52</u>
exclamation point (!)
   as factorial operator, <u>81</u>
   as negation, <u>250</u>, <u>270</u>
EXISTS operator, 229
   with subquery, <u>230</u>
   in where clause, <u>167</u>
EXPLAIN statement, 135
   output of command, <u>135</u>
exponentiation operator (^), <u>80</u>
exporting data
   all data in table, <u>72</u>
   header row, including, <u>63</u>
   limiting columns, 73
   from query results, <u>73</u>, <u>216</u>
   using COPY statement, <u>59</u>, <u>72</u>, <u>216</u>
   using pgAdmin wizard, <u>74</u>
```

```
using the command line, <u>380</u>
   expressions, <u>53</u>, <u>224</u>
     conditional, <u>241</u>
     subquery, 229
  extract() datetime function, <u>206</u>
F
   factorial() function, <u>81</u>
  factorials, <u>80</u>
   false as Boolean value, 94
  Federal Information Processing Standards (FIPS), 65, 295
   field, <u>22</u>
  file paths
     import and export file locations, <u>62</u>
     naming conventions for operating systems, <u>44</u>, <u>62</u>
  filtering rows
     HAVING clause, <u>153</u>, <u>160</u>
     with subquery, <u>224</u>
     WHERE clause, <u>35</u>, <u>224</u>
   findstr Windows command, 162
   FIPS (Federal Information Processing Standards), <u>65</u>, <u>295</u>
   fixed-point numbers, <u>47</u>
   floating-point numbers, <u>48</u>
     inexact math calculations, 49
   Food Safety Inspection Service, <u>158</u>
   foreign key
```

```
creating with REFERENCES keyword, <u>128</u>
  definition, <u>96</u>, <u>128</u>
formatting SQL for readability, 27
forward slash (/)
  as division operator, <u>80</u>
  in macOS file paths, 44
FROM keyword with COPY, <u>62</u>
FULL OUTER JOIN keywords, 102
full-text search, <u>265</u>
  adjacent words, locating, <u>271</u>
  data types, <u>265</u>
  highlighting terms, <u>269</u>
  language configurations, <u>266</u>
  lexemes, 265
  multiple terms in query, <u>270</u>
  querying, <u>268</u>
  ranking results, <u>271</u>
  setting default language, <u>394</u>
  table and column setup, <u>267</u>
  to_tsquery() function, <u>266</u>
  to tsvector() function, <u>265</u>
  ts headline() function, <u>269</u>
  ts rank() function, <u>272</u>
  ts rank cd() function, 272
  using GIN index with, <u>268</u>
functions, <u>337</u>
```

```
difference with procedures, <u>349</u>
  creating, <u>346</u>
  full-text search, <u>265</u>
  IMMUTABLE keyword, <u>348</u>
  RAISE NOTICE keywords, 351
  RETURNS keyword, <u>348</u>
  specifying language, <u>348</u>
  string, <u>246</u>
  structure of, <u>348</u>
generalized inverted index (GIN), 134, 268, 310
generalized search tree (GiST), <u>134</u>, <u>286</u>
generate series() function, <u>209</u>, <u>241</u>, <u>389</u>
GeoJSON, 276, 319
getting help when code goes bad, <u>26</u>
GIN (generalized inverted index), <u>134</u>, <u>268</u>, <u>310</u>
GIS (geographic information systems), <u>276</u>
  decimal degrees, <u>66</u>
GiST (generalized search tree), <u>134</u>, <u>286</u>
GitHub, downloading code resources from, 3
graphical user interface (GUI), <u>292</u>
  list of tools, 407
greater-than comparison operator (>), <u>35</u>
greater-than or equals comparison operator (>=), 35
grep Linux command, <u>162</u>
```

G

```
GROUP BY clause
      with aggregate functions, <u>146</u>
      eliminating duplicate values, <u>146</u>
      on multiple columns, <u>147</u>
Н
   HAVING clause, <u>153</u>, <u>160</u>
   HEADER keyword, <u>63</u>
   header row
      in CSV file, <u>61</u>, <u>64</u>
      ignoring during import, <u>61</u>
   hyphen subtraction operator (-), 79, 331
   identifiers
      avoiding reserved keywords, 119
      enabling mixed case, <u>118</u>
      naming, <u>27</u>, <u>118</u>
      quoting, <u>119</u>
   IDENTITY keyword, <u>46</u>, <u>125</u>
   ILIKE comparison operator, <u>35</u>, <u>37</u>
      case-insensitive search, <u>37</u>
   importing data, <u>59</u>, <u>62</u>
      adding default column value, <u>71</u>
      choosing a subset of columns, <u>68</u>
      choosing a subset of rows, <u>70</u>
      ignoring header row in text files, <u>61</u>, <u>63</u>
```

```
from non-text sources, <u>60</u>
   from text file format, <u>62</u>
   using COPY statement, <u>59</u>
   using pgAdmin wizard, <u>74</u>
   using the command line, <u>380</u>
IN comparison operator, <u>35</u>, <u>172</u>, <u>229</u>
   with subquery, <u>230</u>
indexes, <u>133</u>
   and ANSI SQL standard, 133
   B-tree, <u>134</u>
   considerations before adding, <u>137</u>
   creating on columns, <u>136</u>
   dropping, 137
   effect on performance, <u>135</u>
   GIN, <u>134</u>
   GiST, <u>134</u>, <u>286</u>
   not included with table backups, 168
   syntax for creating, <u>134</u>
initcap() function, <u>246</u>
inserting rows into a table, <u>25</u>
INSERT statement, <u>25</u>
Institute of Museum and Library Services, <u>140</u>
integer data types, <u>45</u>
   auto-incrementing, 46
   basic math operations, <u>79</u>
   bigint, 45
```

```
bigserial, 46
  difference in integer type capacities, <u>45</u>
  integer, <u>45</u>
  serial, <u>46</u>
  smallint, 45
  smallserial, 46
International Date Line, <u>66</u>
International Organization for Standardization (ISO), <u>52</u>, <u>277</u>
  SQL standard, xxiv
  time format, 204
interval data type
  calculations with, <u>53</u>, <u>219</u>
  cumulative, <u>220</u>
  value options, <u>53</u>
interviewing data, <u>29</u>, <u>159</u>
  across joined tables, <u>151</u>
  artificial values as indicators, <u>146</u>, <u>150</u>
  checking for missing values, <u>32</u>, <u>160</u>
  correlations, <u>185</u>
  counting rows and values, <u>143</u>
  determining correct format, <u>32</u>
  finding inconsistent values, <u>162</u>
  malformed values, <u>162</u>
  maximum and minimum values, <u>145</u>
  rankings, <u>193</u>
  rates calculations, <u>196</u>
```

```
statistics, <u>183</u>
      summing grouped values, <u>149</u>
      unique combinations of values, <u>34</u>
   ISO (International Organization for Standardization), <u>52</u>, <u>277</u>
      SQL standard, xxiv
      time format, 204
J
   JOIN keyword, <u>94</u>
      example of using, <u>100</u>
      in from clause, 94
      with using clause, <u>100</u>
  join types
      CROSS JOIN, <u>103</u>, <u>236</u>
      FULL OUTER JOIN, <u>102</u>
      JOIN (INNER JOIN), <u>100</u>, <u>151</u>
      LEFT JOIN, <u>101</u>
      list of, <u>98</u>
      RIGHT JOIN, <u>101</u>
  joining tables, 93
      derived tables, <u>226</u>
      multiple-table joins, <u>107</u>
      naming tables in column list, <u>106</u>, <u>151</u>
      performing calculations across tables, <u>112</u>
      with set operators, <u>109</u>
      spatial joins, <u>300</u>
```

```
specifying columns to query, <u>106</u>
  using JOIN keyword, 94, 97
json agg() function, <u>329</u>
jsonb array elements() function, <u>332</u>
jsonb array elements text() function, <u>332</u>
jsonb array length() function, 331
jsonb build object() function, 329
jsonb set() function, 330
JSON (JavaScript Object Notation), <u>54</u>, <u>305</u>
  array, <u>306</u>
  considerations for using in database, <u>307</u>
  containment operators (@> and <@), 315
  data types, <u>308</u>
     json, 309
     jsonb, <u>309</u>
  existence operators (? and ?1), <u>315</u>, <u>317</u>
  extraction operators, <u>310</u>
  field and element extraction operators (-> and -), <u>310</u>, <u>310</u>–<u>311</u>
  functions
     json agg(), 329
     jsonb array elements(), 332
     jsonb array elements_text(), 332
     jsonb array length(), 331
     jsonb build object(), 329
     jsonb set(), \underline{330}
     to json(), 327
```

```
generating, 327
     GeoJSON format, 319
     importing, <u>309</u>
     indexing, <u>310</u>, <u>319</u>
     json and jsonb data types, <u>54</u>
     key/value pairs, <u>54</u>, <u>306</u>
     manipulating, <u>327</u>
     modifying key/value pairs, <u>329</u>
     object, <u>306</u>
     path extraction operators (#> and ##>), 310, 314
     processing functions, <u>331</u>
     schema flexibility, 306
     structure of, <u>54</u>, <u>306</u>
   justify interval() function, 221
K
  key columns
     foreign key, <u>96</u>
     primary key, 95
     relating tables with, <u>94</u>
  key/value pairs, <u>306</u>
     extracting from JSON, 311
  Korea standard time, <u>212</u>
  LATERAL subquery, <u>231</u>
     with FROM keyword, 231
```

```
with Join keyword, <u>232</u>
latitude
   in US Census data, <u>66</u>
   in well-known text, <u>278</u>
least squares regression line, <u>190</u>
left() function, <u>247</u>
LEFT JOIN keywords, <u>101</u>
length() string function, <u>163</u>, <u>246</u>
less-than comparison operator (<), <u>35</u>
less-than or equals comparison operator (<=), <u>35</u>
lexemes, <u>265</u>
LIKE comparison operator, <u>35</u>
   case-sensitive search, <u>37</u>
LIKE expression in update statement, <u>171</u>
LIMIT clause, <u>67</u>
limiting number of rows query returns, <u>67</u>
linear regression, <u>189</u>
   least squares regression line, <u>190</u>
linear relationship, <u>186</u>
Linux
   file path declaration, 44, 62
   grep command, <u>162</u>
   system permissions, <u>44</u>
   Terminal setup, <u>370</u>
literals, <u>25</u>
localhost, <u>13</u>, <u>20</u>
```

```
localtime function, <u>208</u>
  logical operators, <u>38</u>
  longitude
     positive and negative values, <u>68</u>
     in US Census data, <u>66</u>
     in well-known text, <u>278</u>
   lower() string function, <u>246</u>
M
  macOS
     file path declaration, <u>44</u>, <u>62</u>
     Terminal, 368
        bash shell, <u>368</u>
        entering instructions, <u>369</u>
        setup, <u>368</u>
        useful commands, <u>369</u>
  make date() function, 207
  make time() function, 207
  make timestamptz() function, 207
  many-to-many table relationship, <u>105</u>
  map projection, <u>279</u>
  matching operators, <u>37</u>
   math
     across joined table columns, <u>112</u>
     across table columns, <u>82</u>
     order of operations, <u>81</u>
```

```
math operators, <u>78</u>
   addition (+), <u>79</u>
   division (/), \frac{79}{}
   exponentiation (^), <u>80</u>
   factorial (!), <u>80</u>
   modulo (%), <u>79</u>
   multiplication (*), 79
   square root (+/), <u>80</u>
   subtraction (-), <u>79</u>
max() function, <u>145</u>
median, <u>87</u>
   compared to average, <u>87</u>, <u>217</u>, <u>226</u>
   with percentile cont() function, 89
Microsoft Access, xxv
Microsoft Excel, xxv
Microsoft SQL Server, <u>118</u>, <u>237</u>
   BULK INSERT command, 60
   Transact-SQL, xxiv
Microsoft Windows
   Command Prompt
      entering instructions, <u>366</u>
      setup, <u>364</u>, <u>366</u>
      useful commands, <u>367</u>
   file path declaration, <u>43</u>, <u>62</u>
   findstr command, <u>162</u>
   folder permissions, 3
```

```
min() function, <u>145</u>
  mode, <u>91</u>
  mode () function, 91
  modifying data, <u>164</u>
     for consistency, <u>170</u>
     updating column values, <u>169</u>
  modulo, <u>79</u>
     testing for even numbers, <u>80</u>
  multiplying numbers, <u>79</u>
  MySQL, xxv
     LOAD DATA INFILE statement, 60
Ν
  NAICS (North American Industry Classification System), <u>197</u>
  naming conventions
     camel case, <u>118</u>
     Pascal case, <u>118</u>
     snake case, <u>118</u>, <u>120</u>
  National Center for Education Statistics, <u>401</u>
  National Center for Health Statistics, 404
  natural primary key, <u>121</u>, <u>159</u>
  New York City taxi data, 213
     creating table, <u>213</u>
     exporting results, <u>216</u>
     finding busiest hour of day, 215
     importing, <u>214</u>
```

```
longest trip duration, <u>217</u>
normal distribution, 192, 226
North American Industry Classification System (NAICS), 197
NoSQL databases, <u>307</u>
NOT comparison operator, <u>35</u>
not-equal comparison operator
   <> syntax, <u>35</u>
   ! = syntax, <u>35</u>
NOT NULL keywords, 132
   adding to column, <u>165</u>
   removing from column, <u>133</u>, <u>165</u>
now() function, <u>52</u>, <u>208</u>
NULL keyword
   comparisons using is distinct from, <u>169</u>
   definition, <u>104</u>
   display in query results, <u>105</u>
   ordering with first and last, 161
  using in table joins, <u>104</u>
   using in where clause, <u>104</u>
number data types, 44
   decimal types, 47
     decimal, 47
     double precision, 48
     fixed-point type, \frac{47}{1}
     fixed-point vs. floating-point types, <u>48</u>
     floating-point types, <u>48</u>
```

```
numeric, 47
     real, <u>48</u>
   integer types, 45
     bigint, 45
     bigserial, 45
     integer, 45
     serial, <u>45</u>
      smallint, 45
      smallserial, 45
   usage considerations, <u>50</u>
OGC (Open Geospatial Consortium), 277
on clause used with Join, 94
one-to-many table relationship, <u>105</u>, <u>128</u>
one-to-one table relationship, <u>105</u>
on keyword used with delete cascade, <u>129</u>
Open Geospatial Consortium (OGC), <u>277</u>
operators
   addition (+), <u>79</u>
   comparisons with, <u>35</u>
   division (/), \frac{79}{}
   exponentiation (^), <u>80</u>
   factorial (!), <u>80</u>
   JSON, <u>310</u>
  modulo (%), <u>79</u>
```

0

```
multiplication (*), 79
     precedence, <u>81</u>
     prefix, <u>81</u>
     square root (+/), <u>80</u>
     subtraction (-), <u>79</u>
     suffix, <u>81</u>
   Oracle, xxiv
  ORDER BY clause, 32
     ASC, DESC options, <u>32</u>
     with count () function, <u>148</u>
     on multiple columns, <u>33</u>
     specifying columns to sort, <u>32</u>
     specifying NULLS first or last, 161
   OR logical operator combining comparison operators, <u>38</u>
   OVER clause with window functions, 193
P
   Pacific time zone, <u>52</u>, <u>211</u>
   padding character columns with spaces, <u>42</u>, <u>44</u>
   parentheses ()
     to designate order of operations, <u>38</u>
     to specify columns for importing, <u>70</u>
   Pascal case, <u>118</u>
  path deletion operator, JSON (#-), <u>331</u>
  pattern matching
     using like and ilike, <u>37</u>, <u>171</u>
```

```
with wildcards, <u>37</u>
Pearson correlation coefficient (r), <u>186</u>
percentage
   percent change, <u>85</u>
      creating user function, <u>347</u>
      formula, <u>85</u>, <u>113</u>, <u>347</u>
   of the whole, <u>84</u>
percent change () user function, <u>347</u>
   using with census data, <u>348</u>
percentile, <u>88</u>, <u>224</u>
   continuous vs. discrete values, <u>88</u>
   definition of, <u>88</u>
percentile cont() function, 88
   finding median with, <u>217</u>
   in subquery, <u>224</u>
   using an array to enter multiple values, <u>90</u>
percentile disc() function, <u>88</u>
percent sign (%)
   as modulo operator, <u>80</u>
   wildcard for pattern matching, <u>37</u>
pgAdmin, 11
   alternatives to, <u>407</u>
   connecting to database, <u>20</u>, <u>22</u>
   connecting to server, <u>12</u>
   drag and drop objects, <u>32</u>
   executing SQL, <u>20</u>, <u>21</u>
```

```
geometry viewer, <u>324</u>
   importing and exporting data, <u>74</u>
   installation
      Linux, 9
      macOS, 8
      Windows, \frac{4}{}
   keyword highlighting, 119
   launching, 11
   localhost, <u>13</u>, <u>20</u>
   master password, 11
   object browser, <u>12</u>, <u>21</u>, <u>24</u>
   preferences, <u>15</u>
   Query Tool, <u>14</u>, <u>20</u>
   .sql files, 3
   viewing data, <u>26</u>, <u>31</u>, <u>95</u>, <u>144</u>
   viewing tables, <u>65</u>
   viewing table SQL statements, <u>24</u>
   viewing text in results grid, <u>254</u>
   views, <u>339</u>
pg ctl utility, 395
pg dump utility, 395
pg reload_conf() function, 394
pg restore utility, <u>396</u>
pg size pretty() function, <u>389</u>
pg total relation size() function, <u>389</u>
pipe character (1)
```

```
as delimiter, <u>44</u>, <u>63</u>, <u>72</u>
   to redirect output, <u>295</u>
PL/pgSQL, <u>347</u>, <u>350</u>
   BEGIN ... END block, 356
   IF ... THEN statement, 356
point, <u>66</u>
position() string function, <u>246</u>
PostGIS
   creating spatial objects, <u>281</u>
   data types, <u>280</u>, <u>281</u>
   displaying version, <u>276</u>
   functions
     ST AsText(), <u>295</u>
     ST DFullyWithin(), 288
      ST Distance(), \underline{289}
     ST DWithin(), <u>287</u>, <u>326</u>
     ST GeogFromText(), <u>283</u>, <u>288</u>, <u>326</u>
      ST GeometryType(), 300
     ST GeomFromText(), 281
      ST Intersection(), 301
      ST Intersects(), 301
      ST LineFromText(), 284
      ST MakeLine(), 284
      ST MakePoint(), 283, 324
     ST MakePolygon(), 284
      ST MpolyFromText(), 284
```

```
ST PointFromText(), 283
      ST PolygonFromText(), <u>284</u>
      ST SetSRID(), <u>286</u>, <u>324</u>
   installation, <u>276</u>
      Linux, <u>11</u>
      macOS, 8
      Windows, 5
   loading extension, <u>276</u>, <u>324</u>
   shapefile, <u>292</u>, <u>295</u>, <u>383</u>
   spatial joins, <u>300</u>
Postgres.app, <u>20</u>
PostgreSQL
   backup and restore, <u>395</u>
      pg dump, <u>395</u>
      pg_restore, 396
   command line usage, <u>363</u>
   comparison operators, <u>36</u>
   configuration, <u>387</u>
   creating functions, <u>346</u>
   default postgres database, 19
   description of, <u>12</u>, <u>19</u>
   documentation, <u>410</u>
   functions, <u>337</u>
   GUI tools, <u>407</u>
   importing from other database managers, <u>60</u>
   installation, <u>1</u>, <u>3</u>
```

```
Linux, 9
      macOS, 8
      Windows, 4
   JSON support, <u>308</u>
   maintenance, <u>387</u>
   modules, <u>237</u>
   news and community, 409
   pg operator table, <u>79</u>
   postgresql.conf settings file, 393
   procedure, <u>349</u>
   recovering unused space, <u>388</u>
   settings, <u>392</u>
   spatial data analysis, <u>275</u>, <u>287</u>, <u>289</u>
   starting and stopping, <u>395</u>
   statistics collector, <u>391</u>
   table size, <u>388</u>
   triggers, <u>337</u>, <u>354</u>
   utilities, tools, and extensions, <u>408</u>
   version() function, <u>14</u>
   views, <u>337</u>
postgresql.conf settings file, 210, 393
   editing, <u>393</u>
   location of, 393
   reloading settings, <u>395</u>
precision input for numeric and decimal types, 47
primary key, <u>18</u>, <u>31</u>
```

```
composite, <u>121</u>, <u>124</u>
   definition of, <u>95</u>, <u>121</u>
   natural, <u>96</u>, <u>121</u>, <u>159</u>
   surrogate, <u>122</u>, <u>126</u>
      auto-incrementing, <u>125</u>
   syntax, <u>99</u>, <u>123</u>, <u>124</u>
   uniqueness, <u>96</u>
   using auto-incrementing serial type, 46, 122
   violation, <u>124</u>
Prime Meridian, <u>66</u>, <u>280</u>
procedural language, <u>347</u>
procedures
   CALL command, <u>352</u>
   difference with functions, <u>349</u>
   updating data with, <u>349</u>
projection (map), <u>279</u>
   Albers, <u>279</u>
psql command line application, <u>364</u>
   connecting to database, <u>370</u>, <u>372</u>
   displaying table info, <u>379</u>
   editing queries, <u>375</u>
   executing queries from a file, <u>382</u>
   formatting results, <u>375</u>
   help commands, <u>372</u>
   importing and exporting files, <u>380</u>
   meta-commands, <u>379</u>, <u>389</u>
```

```
multiline queries, <u>374</u>
      NULL value display, <u>105</u>
      paging results, <u>376</u>
      parentheses in queries, <u>374</u>
      passing in SQL commands, 381
      password file, <u>373</u>
      running queries, <u>374</u>
      saving query output, <u>381</u>
      setup
         Linux, <u>370</u>
         macOS, <u>368</u>
         Microsoft Windows, <u>364</u>
   Public Libraries Survey, <u>140</u>
      creating tables, <u>140</u>–<u>141</u>
   Python programming language, xxv
      creating PL/Python extension, <u>352</u>
      in PostgreSQL function, <u>347</u>, <u>352</u>
      installation
         macOS, 9
         Windows, 5
Q
   quantiles, <u>88</u>
   quartiles, <u>90</u>
   query
      choosing order of columns, <u>31</u>
```

```
definition of, <u>17</u>
     eliminating duplicate values, <u>34</u>
     execution time, <u>135</u>
     exporting results of, <u>73</u>
     limiting number of rows returned, <u>67</u>
     measuring performance with EXPLAIN, 135
     order of clauses, <u>39</u>
     retrieving a subset of columns, <u>31</u>
     selecting all rows and columns, <u>30</u>
  quintiles, <u>90</u>
   quotes, single vs. double, 25
R
  r (Pearson correlation coefficient), <u>186</u>
   rank() function, <u>193</u>
  ranking data, <u>193</u>
     rank() and dense rank() functions, 193
     by subgroup, 195
  rates calculations, <u>196</u>, <u>227</u>, <u>235</u>
  record_if_grade_changed() user function, <u>356</u>
  REFERENCES keyword declaring foreign key, 128
  referential integrity
     cascading deletes, <u>129</u>
     foreign keys, <u>128</u>
     primary key, <u>124</u>
   regexp match() function, 255
```

```
extracting text from result, <u>260</u>
regexp matches() function, <u>256</u>
regexp replace() function, <u>252</u>
regexp split to array() function, <u>252</u>
regexp split to table() function, <u>252</u>
regular expressions, <u>247</u>
   capture group, <u>249</u>, <u>257</u>
   escaping characters, <u>255</u>
   examples, <u>250</u>
   notation, <u>248</u>
   parsing unstructured data, 253, 258
   regexp match() function, <u>255</u>
   regexp matches() function, <u>256</u>
   regexp replace() function, <u>252</u>
   regexp split to array() function, <u>252</u>
   regexp split to table() function, <u>252</u>
   with substring() function, <u>250</u>
   in where clause, <u>250</u>
relational database, <u>93</u>
   related tables, 18
relational model, <u>93</u>
   reducing redundant data, <u>97</u>
   table relationships, <u>105</u>
replace() string function, <u>247</u>
reserved keywords, <u>119</u>
RETURNING clause, <u>170</u>
```

```
with update statement, 167
   right() function, <u>247</u>
   RIGHT JOIN keyword, 101
   ROLLBACK statement in transaction block, <u>177</u>
  roots, square and cube, <u>80</u>
   round() function, <u>86</u>, <u>188</u>
   row
      constructor, <u>328</u>
      counting, <u>143</u>
      in CSV file, <u>60</u>
      definition, 93
      deleting, <u>175</u>
      generating from JSON array, 332
      inserting, <u>25</u>
      recovering unused, <u>388</u>
      specifying in window function, <u>200</u>
      updating specific, <u>169</u>
   row() function, <u>328</u>
   R programming language, xxv
   r-squared (coefficient of determination), <u>191</u>
S
   scalar subquery, 224
   scale input for numeric and decimal types, <u>47</u>
   scatterplot, <u>186</u>, <u>188</u>
   selecting all rows and columns, 30
```

```
SELECT statement
  definition, <u>30</u>
  order of clauses, 39
semicolon (;), <u>19</u>
server
  localhost, <u>20</u>
  postgresql.conf file, 210
  setting time zone, <u>210</u>
set keyword
  clause in update statement, 166
  TIME ZONE, 211
set operators, <u>109</u>
  EXCEPT, <u>1111</u>
  INTERSECT, <u>1111</u>
  UNION, <u>109</u>
  UNION ALL, <u>109</u>
setting up your coding environment, 1
shapefile, <u>291</u>
  contents of, <u>292</u>
  loading into database, <u>292</u>
  shp2pgsq1 command line utility, 383
  US Census TIGER/Line, 292, 300
show command
  config file, 393
  data_directory, 395
  timezone, 209
```

```
view all server settings with, <u>210</u>
shp2pgsq1 command line utility, 383
simple feature standard, <u>277</u>
slope-intercept formula, <u>190</u>
snake case, <u>118</u>
sorting data, <u>32</u>
  on aggregate results, <u>149</u>
  by multiple columns, <u>33</u>
spatial data
  area analysis, <u>296</u>
  building blocks of, <u>276</u>
  converting JSON to, <u>323</u>
  data types, 280
  distance analysis, <u>287</u>, <u>289</u>
  finding location, 297
  geographic coordinate system, 276, 279
  geometries, <u>277</u>, <u>281</u>, <u>283</u>, <u>284</u>, <u>319</u>
  intersection analysis, <u>301</u>
  joins, <u>300</u>
  projection, <u>279</u>
  shapefile, 291
  simple feature standard, <u>277</u>
  spatial reference system identifier (SRID), 277, 279
  well-known text (WKT), <u>278</u>
  WGS 84 coordinate system, <u>280</u>
spatial reference system identifier (SRID), <u>277</u>, <u>279</u>
```

```
setting with ST SetSRID(), 286
SQL
  history of, xxiv
  indenting code, <u>27</u>
  math operators, <u>78</u>
  relational model, 93
  reserved keywords, 119
  style conventions, <u>23</u>, <u>27</u>, <u>56</u>
  using with external programming languages, xxvi
  value of using, <u>xxiv</u>, <u>xxv</u>
  variations among databases, xxiv
sqrt() function, <u>81</u>
square root operator (+/), <u>81</u>
SRID (spatial reference system identifier), <u>277</u>, <u>279</u>
  setting with ST SetSRID(), 286
START TRANSACTION statement, 177
statistical functions, <u>183</u>
  correlation with corr (), <u>186</u>
  dependent and independent variables, <u>186</u>
  linear regression, <u>189</u>–<u>190</u>
      regr intercept() function, <u>190</u>
     regr_slope() function, <u>190</u>
  rates calculations, <u>196</u>
  rolling average, <u>198</u>
  standard deviation, <u>192</u>
  variance, <u>192</u>
```

```
string functions, 246
  case formatting, <u>246</u>
  character information, <u>246</u>
  char length(), \underline{246}
  extracting and replacing characters, <u>247</u>
  initcap(), 246
  left(), 247
  length(), <u>246</u>
  lower(), <u>246</u>
  position(), 246
  removing characters, <u>247</u>
  replace(), 247
  right(), <u>247</u>
  to char(), 219
  trim(), 247
  upper(), <u>246</u>
subquery
  correlated, <u>224</u>
  with crosstab() function, <u>239</u>
  definition, 223
  in delete statement, <u>225</u>
  expressions, 229
  generating column with, <u>228</u>
  IN operator expression, <u>230</u>
  with Lateral, <u>231</u>
  scalar, <u>224</u>
```

```
uncorrelated, <u>224</u>
      in where clause, 224
   substring() function, <u>250</u>
   subtracting numbers, <u>79</u>
      across columns, <u>82</u>
   sum() function, <u>86</u>
      example on joined tables, <u>149</u>
      grouping by column value, <u>152</u>
   summarizing data, 139
   surrogate primary key, <u>122</u>
      creating, <u>126</u>
Т
   tab character as delimiter, 63
   table
      add column, <u>165</u>, <u>168</u>
      aliases, <u>107</u>, <u>226</u>
      alter column, <u>165</u>
      autovacuum, 390
      constraints, 23
      creating, 22
      dead tuples, 388
      definition of, <u>17</u>
      deleting column, <u>165</u>, <u>176</u>
      deleting data, <u>175</u>
      derived table, 225
```

```
design best practices, <u>117</u>
   dropping, <u>176</u>
   holds data on one entity, 93
   indexes, <u>133</u>
   inserting rows, 25
   key columns, <u>94</u>
   modifying with ALTER statement, 164
   naming, <u>120</u>
   querying multiple tables using joins, <u>97</u>
   relationships, <u>17</u>
   size, <u>388</u>
   temporary tables, <u>71</u>
   viewing data, <u>26</u>
tablefunc module, installing for crosstab(), \underline{237}
table relationships
   many to many, <u>105</u>
   one to many, <u>105</u>, <u>128</u>
   one to one, <u>105</u>
TABLE statement, <u>31</u>
telling your data's story, <u>399</u>
   asking why, <u>405</u>
   assessing the data's origins, <u>402</u>
   building your own database, 401
   communicating your findings, <u>405</u>
   consulting the data's owner, <u>403</u>
   documenting your process, <u>400</u>
```

```
gathering your data, 400
  identifying trends over time, 403
  interviewing the data with queries, <u>402</u>
  starting with a question, <u>400</u>
temporary table
  declaring, <u>71</u>
  removing with drop table, 71
text
  case formatting, <u>246</u>
  concatenation, <u>172</u>
  editors, 2
  escaping characters, <u>255</u>
  extracting and replacing characters, <u>247</u>
  formatting with functions, <u>246</u>
  matching patterns with regular expressions, <u>247</u>
  removing characters, <u>247</u>
text data type, 42
text editors, 2
TEXT file format, 63
text qualifier
  ignoring delimiters with, 61
  specifying with QUOTE option in COPY, 63
tilde-asterisk case-insensitive matching operator (~*), <u>250</u>
tilde case-sensitive matching operator (\sim), <u>250</u>
time, matching with regular expression, <u>249</u>
time data types
```

```
interval, <u>51</u>
   time, <u>51</u>
   timestamp, <u>51</u>, <u>204</u>
timestamp, <u>51</u>, <u>204</u>
   calculations with, <u>212</u>
   creating from components, <u>207</u>, <u>261</u>
   extracting components from, <u>205</u>
   formatting display, 219
   retrieving current date and time, <u>208</u>
   subtracting to find interval, <u>219</u>
   with time zone, <u>51</u>
   within transaction, <u>208</u>
time zones
   AT TIME ZONE keywords, 212
   automatic conversion of, <u>205</u>
   including in timestamp, <u>51</u>, <u>204</u>, <u>262</u>
   setting, <u>210</u>
   setting server default, <u>394</u>
   standard name database, <u>52</u>
   viewing names of, <u>210</u>
   viewing server setting, <u>209</u>
   working with, <u>209</u>
to char() function, <u>219</u>
to json() function, <u>327</u>
to timestamp() function, <u>320</u>
to tsquery() function, <u>266</u>
```

```
to tsvector() function, <u>265</u>
transaction block
  COMMIT, <u>177</u>
  definition of, <u>177</u>
  ROLLBACK, <u>177</u>
   START TRANSACTION, 177
  with time functions, <u>208</u>
  visibility to other users, <u>179</u>
triggers, <u>337</u>, <u>354</u>
  BEFORE INSERT statement, <u>359</u>
  CREATE TRIGGER statement, <u>356</u>
  EXECUTE PROCEDURE statement, <u>357</u>
  FOR EACH ROW statement, <u>356</u>
  FOR EACH STATEMENT statement, <u>356</u>
  NEW and OLD variables, 356
  testing, <u>357</u>, <u>360</u>
trim county() user function, 353
trim() function, <u>247</u>
true as Boolean value, <u>94</u>
TRUNCATE statement, <u>176</u>
  restarting identity sequence with, <u>176</u>
ts headline() function, <u>269</u>
tsquery data type, <u>266</u>
ts rank() function, <u>272</u>
ts rank cd() function, 272
tsvector data type, <u>265</u>
```

```
uncorrelated subquery, <u>224</u>
underscore wildcard for pattern matching ( ), <u>37</u>
UNIQUE constraint, 96, 131
universally unique identifier (UUID), <u>55</u>, <u>122</u>
  as primary key, <u>122</u>
unnest() function, 91
unstructured data, <u>245</u>
  parsing with regular expressions, <u>253</u>, <u>258</u>
update personal days() user function, 350
UPDATE statement
  with CASE, <u>262</u>
  definition, 166
  PostgreSQL-specific syntax, <u>167</u>
  with RETURNING clause, <u>167</u>, <u>170</u>, <u>262</u>
  with SET clause, <u>166</u>
  using across tables, <u>166</u>, <u>173</u>
upper() function, <u>246</u>
USA Today, xxiii
US Census
  American Community Survey, 2014–2018, 184
     description of columns, <u>184</u>
     importing data, <u>184</u>
  County Business Patterns, <u>197</u>
  county population estimates, <u>63</u>, <u>295</u>
     adding and subtracting columns, <u>82</u>
```

```
description of columns, 65
      finding average county population, <u>87</u>
      finding median county population, 89
      importing data, <u>64</u>
     percent calculations with, <u>84</u>
     performing calculations across tables, <u>112</u>
   methodologies compared, 185, 402
   trade data, <u>200</u>
US Department of Agriculture, <u>158</u>, <u>402</u>
   farmers' market data, 285
US Geological Survey, 318
UTC (Coordinated Universal Time), <u>52</u>, <u>206</u>
   UTC offset, <u>52</u>, <u>206</u>, <u>219</u>
UUID (universally unique identifier), <u>55</u>, <u>122</u>
   as primary key, <u>122</u>
VACUUM command, <u>388</u>
   ANALYZE option, <u>391</u>
   autovacuum process, <u>390</u>
   editing server setting, <u>393</u>
   FULL option, 392
   monitoring table size, <u>388</u>
   purpose of, <u>388</u>
   running manually, <u>392</u>
   time of last vacuum, 391
```

```
VERBOSE option, <u>392</u>
   VALUES clause with INSERT, 25
   varchar, <u>23</u>, <u>42</u>
      also specified as character varying, <u>42</u>
   version() function, <u>14</u>
   views, <u>337</u>
      advantage of using, 338
      creating, 338
      deleting data with, <u>346</u>
      dropping, 339
      inserting data with, <u>342</u>, <u>344</u>
      LOCAL CHECK OPTION, 344
      materialized, <u>338</u>
      queries in, <u>339</u>
      retrieving specific columns, <u>341</u>
      security barrier option, <u>343</u>
      updating data with, <u>342</u>, <u>345</u>
W
   Wall Street Journal, xxiv
   well-known text (WKT), <u>278</u>
      extended, 283
      order of coordinates, <u>278</u>
   WHEN clause in Case statement, 241
   WHERE clause, <u>35</u>
      in COPY statement, <u>70</u>
```

```
with DELETE statement, <u>175</u>
      with EXISTS operator, <u>167</u>
      with is null keywords, <u>161</u>
      with JSON operators, <u>316</u>
      with LIKE expression, <u>171</u>
      with regular expressions, <u>250</u>
      in update statement, <u>166</u>
   whole numbers, 45
   wildcard
      percent sign (%), 37
      underscore (), 37
   window functions
      definition of, <u>193</u>
      OVER clause, <u>193</u>, <u>220</u>
      PARTITION BY clause, <u>195</u>
      specifying rows, <u>200</u>
   with keyword
      defining common table expression, <u>234</u>
      options with COPY, <u>44</u>, <u>62</u>
   WKT (well-known text), <u>278</u>
      extended, <u>283</u>
      order of coordinates, <u>278</u>
   working tables, <u>176</u>
X
   XML, <u>55</u>
```

ZIP codes, <u>163</u> loss of leading zeros, <u>163</u>