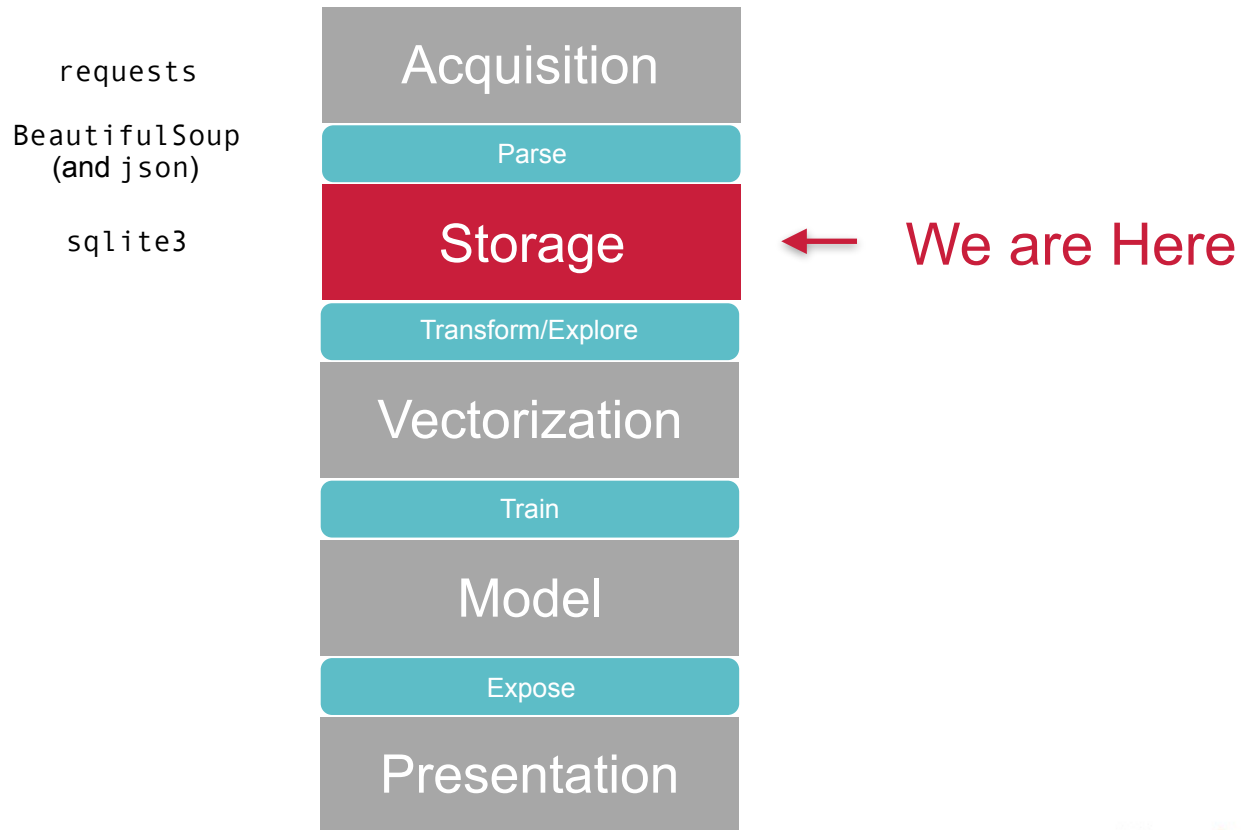




## Lesson 5: Storing Data: Relational Databases (with SQLite)

# Process + Tools



# ETL Pipeline



# Database versus Flat Files

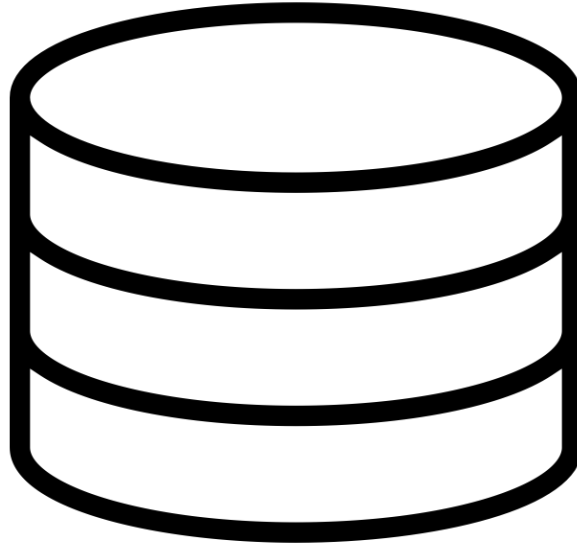
## Relation Database (SQL)

- Enables powerful queries
- Performant (SQL optimizer)
- Often have to run a separate database process/server

## Flat Files

- More portable
- Easy to analyze and inspect
- Needs a programming environment

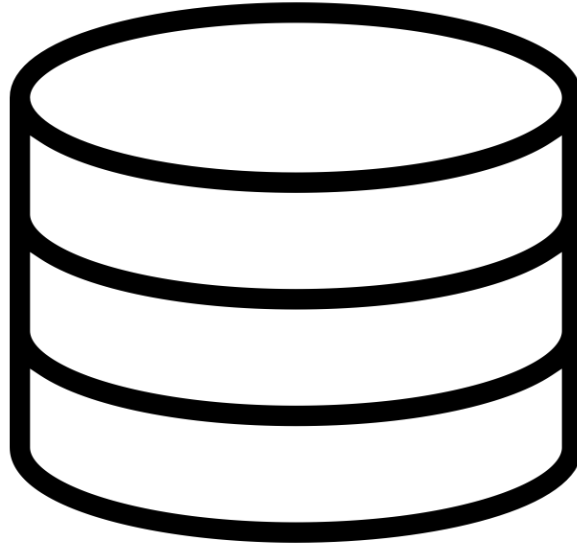
# Relational Databases 101



Created by lastspark  
from Noun Project

# Relational Databases 101

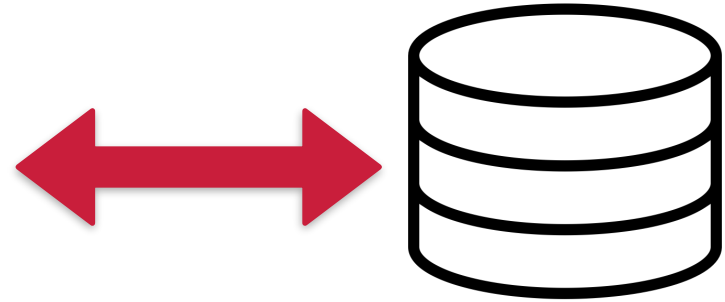
Usually runs in  
separate process  
(in background)



Created by lastspark  
from Noun Project

# Relational Databases 101

```
jonathandinus$ postgres -D /usr/local/pgsql/data
```



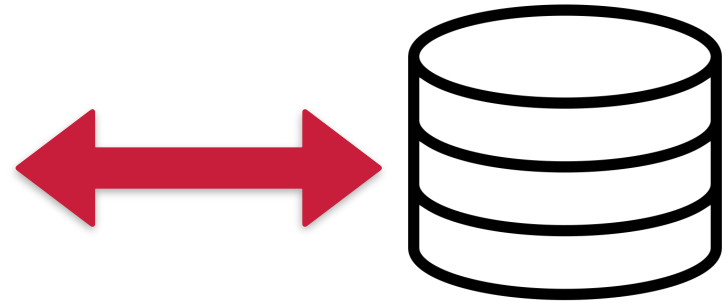
Created by lastspark  
from Noun Project

## **A Happy Marriage Between the Two (Traditional relational DB and Flat Files)**



# SQLite

```
jonathandinu$ sqlite3 better_breakfasts.db
```



Created by lastspark  
from Noun Project

## Relation Database (SQL)

- Enables powerful queries
- Performant (SQL optimizer)
- Transactional
- Often have to run a separate database process/server

## Flat Files

- More portable
- Easy to analyze and inspect
- Needs a programming environment

## Relation Database (SQL)

- **Enables powerful queries**
- **Performant (SQL optimizer)**
- **Transactional**
- ~~Often have to run a separate database process/server~~

## Flat Files

- **More portable**
- **Easy to analyze and inspect**
- ~~Needs a programming environment~~

- Portable (cross platform, single .db file)
- Easy to analyze and inspect: sqlite shell, programming APIs, human readable DB file format
- Powerful, performant (SQL optimizer), and transactional queries
- Zero-Configuration and Serverless
- Compact and Embeddable
- Public Domain (open source)

# Interfacing with a Database

## SQL

- Command Line Shell
- Graphical Browser

## Programmatic

- Database Adapter
- Object Relational Mapper
- REST interface\*

\*not every database has a built-in REST interface

# Database Types

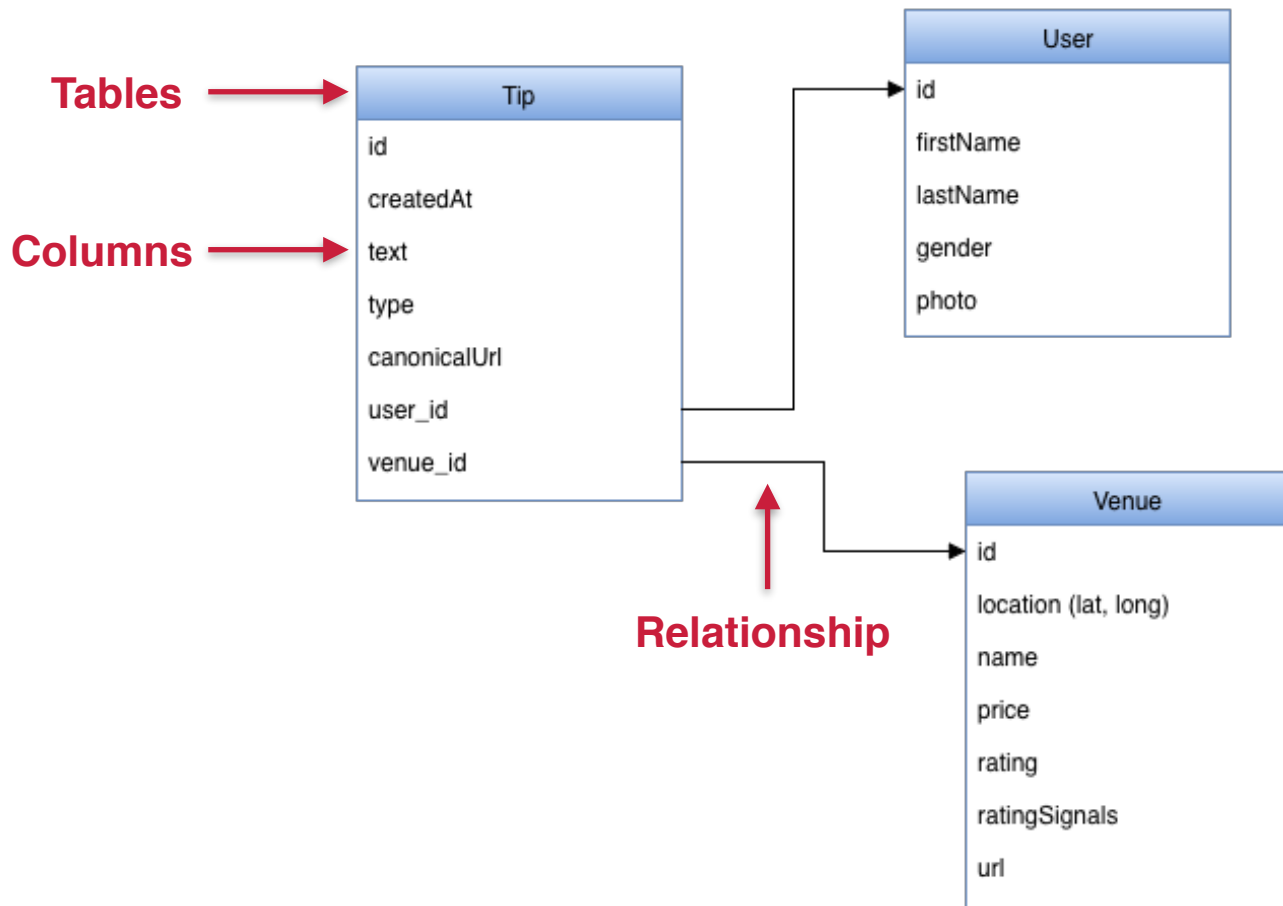
Type	Advantage	Disadvantage	Example
Graph	Complex relations and optimized graph & network operations	Can be overkill for independent (or unrelated) data	Neo4j, OrientDB
Relational	Transactions, joins, & expressive queries	Inflexible schemas & can be difficult to distribute/scale	Postgres, MySQL
Document	Flexible data model, hierarchical, and often full-text search	No (true) schema, joins or transactions	MongoDB, CouchDB
Columnar	Scalable with optimized analytic operations (OLAP)	Can be complex and often distributed	HBase, Bigtable
Key Value	Performant and simple to work with	Limited data model and querying	Redis, Dynamo

# What's in a Schema

*The term "schema" refers to the organization of data as a blueprint of how the database is constructed (divided into database tables in the case of relational databases).*

- Wikipedia

# Schema





# What's in a Schema

Table

Relationships

```
CREATE TABLE reviews(  
  "listing_id" TEXT,  
  "id" TEXT,  
  "date" TEXT,  
  "reviewer_id" TEXT,  
  "reviewer_name" TEXT,  
  "comments" TEXT  
);
```

Columns/Fields

Data Type

The diagram illustrates the components of a SQL schema using the example code. A blue arrow points from the word 'Table' to the 'reviews' table name. Another blue arrow points from the word 'Relationships' to the 'listing\_id' column, which is highlighted with a blue box. A blue arrow points from the word 'Columns/Fields' to the opening parenthesis of the column list. A blue arrow points from the word 'Data Type' to the 'TEXT' data type associated with the 'comments' column.

# Data Types

## Discrete

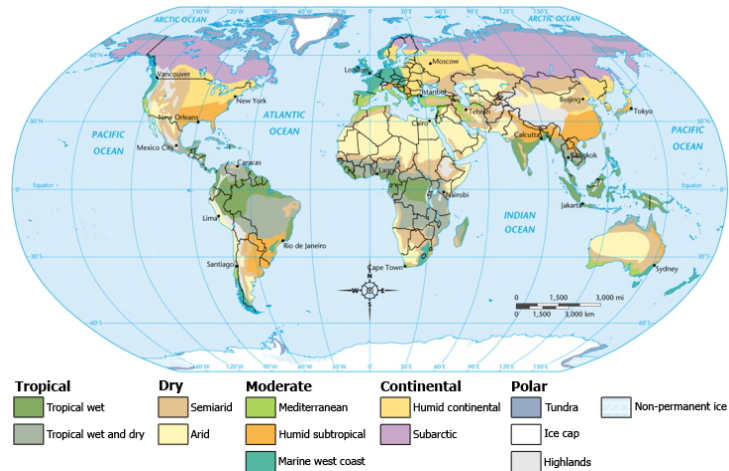
- Countably Finite
- Often human artifacts
- Finite Granularity
- Ex: weight class, climate, date

## Continuous

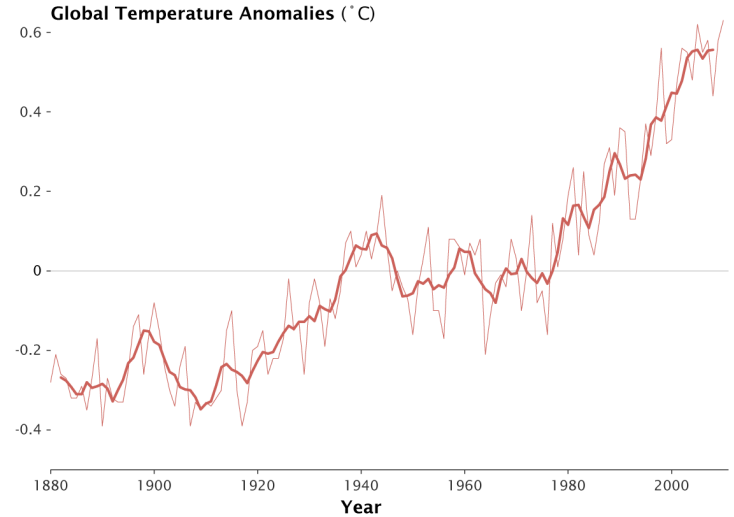
- Uncountably (even in finite interval) real valued.
- Typically represent natural phenomenon
- Can always get more precise
- Ex: mass, temperature, time

# Data Types

## Discrete



## Continuous

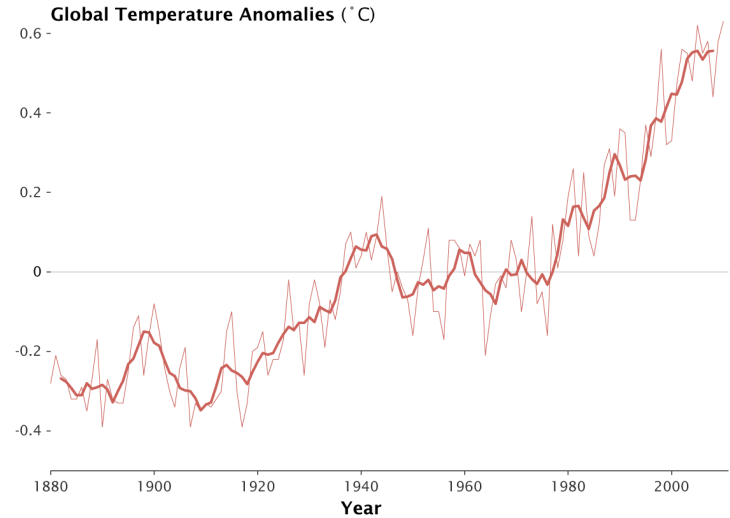
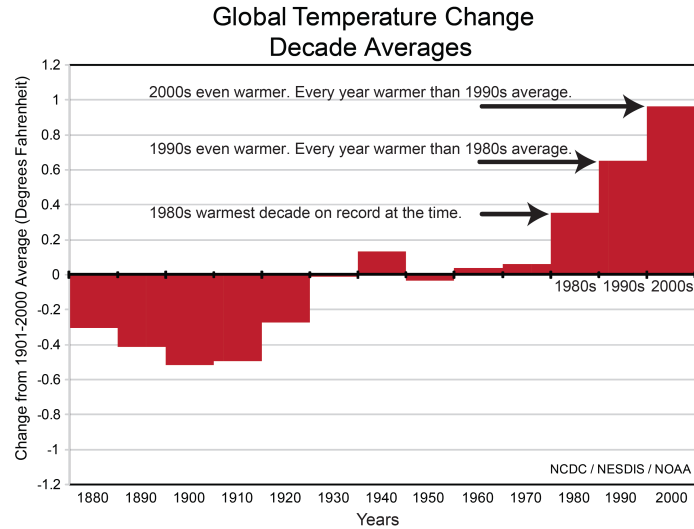


# Data Types

Discrete

always some loss of information

Continuous



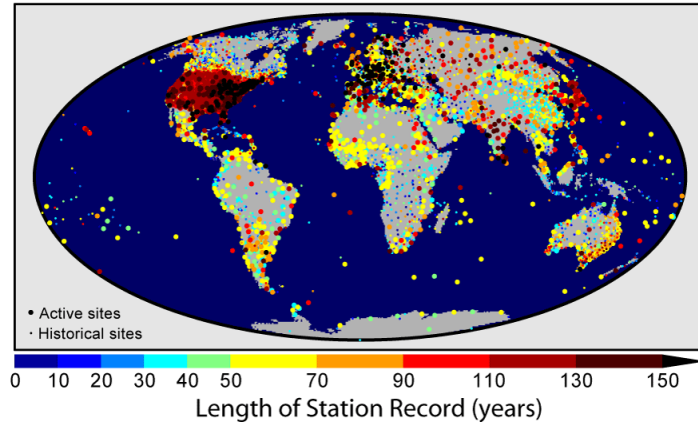
# Data Types

Discrete

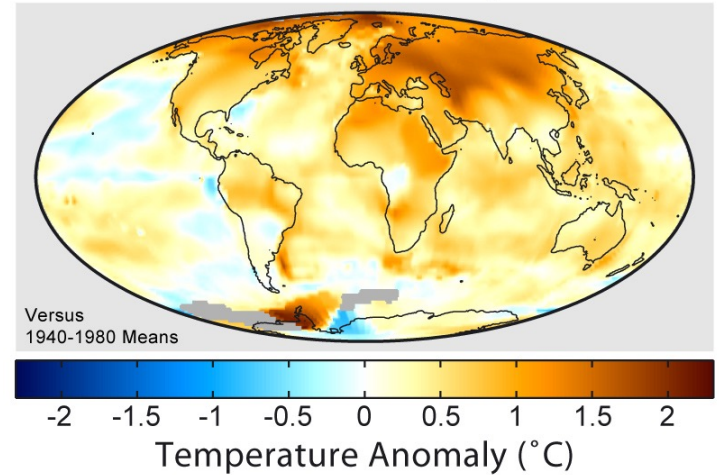
always error/bias in estimation

Continuous

Global Climate Network Temperature Stations



1999-2008 Mean Temperatures



# Data Types

## Discrete

- integer
- date
- varchar
- text
- uuid
- boolean
- NULL\*

## Continuous

- real
- float
- [decimal/numeric](#)
- timestamp/time

# Object Relational Mappers

```
class Venue:
    def __init__(self, **data):
        self.id = data['id']
        self.name = data['name']
        self.price = data['price']
        self.rating = data['rating']
        self.ratingSignals = data['ratingSignals']
        self.url = data['url']
        self.latitude = data['latitude']
        self.longitude = data['longitude']
```

## Venue Table

id	name	price	rating	rating Signals	url	lat	long

```
class User:
    def __init__(self, **data):
        self.id = data['id']
        self.firstName = data['firstName']
        self.lastName = data['lastName']
        self.gender = data['gender']
        self.photo = data['photo']
```

## User Table

id	firstName	lastName	gender	photo

# Object Relational Mappers

```
cafe = Venue(**v).save()  
bar = Venue(**w).save()
```

## Venue Table

id	name	price	rating	rating Signals	url	lat	long
1	cafe	...	...	...	...	...	...
2	bar	...	...	...	...	...	...

```
jessica = User(**u).save()
```

## User Table

id	firstName	lastName	gender	photo
1	Jessica	...	...	...



# Object Relational Mappers (ORM)

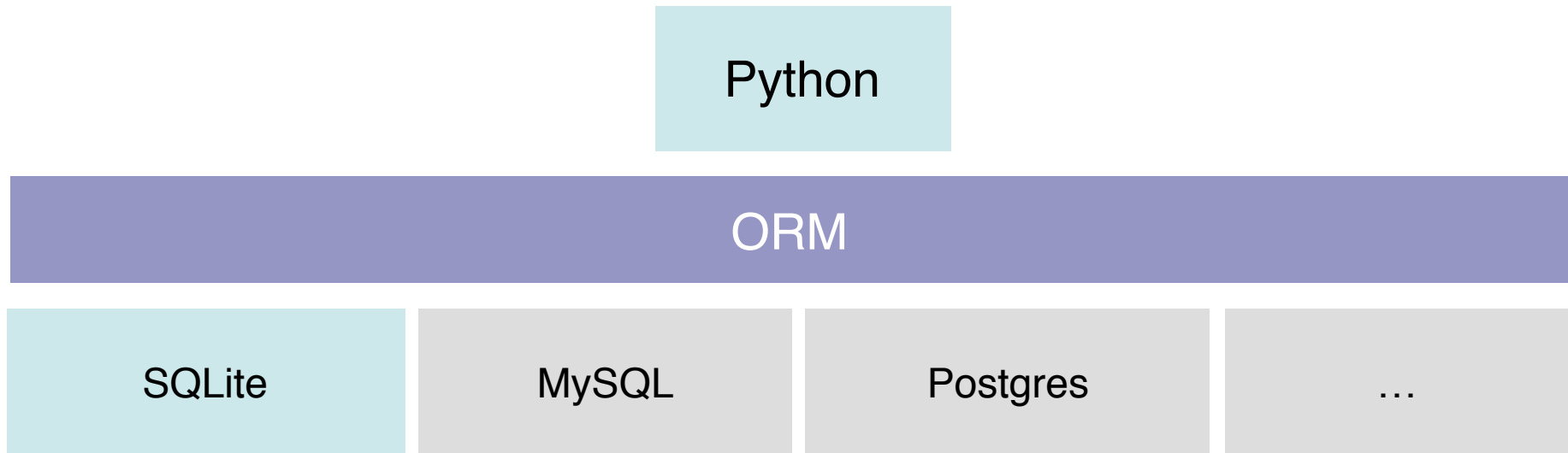
## Advantages

- Abstracts Underlying Processes
- Separation of Concerns (storage infrastructure from application)
- Single Language (and common interface)
- Custom Functions Possible

## Disadvantages

- Abstracts Underlying Processes
- Additional Complexity (more moving parts)
- Object-relational Impedance Mismatch

# Separation of Concerns



# Extract Transform Load (ETL)

- **Extract** data from homogeneous or heterogeneous data sources
- **Transform** the data for storing it in the proper format or structure for the purposes of querying and analysis
- **Load** it into the final target (database, more specifically, operational data store, data mart, or data warehouse)

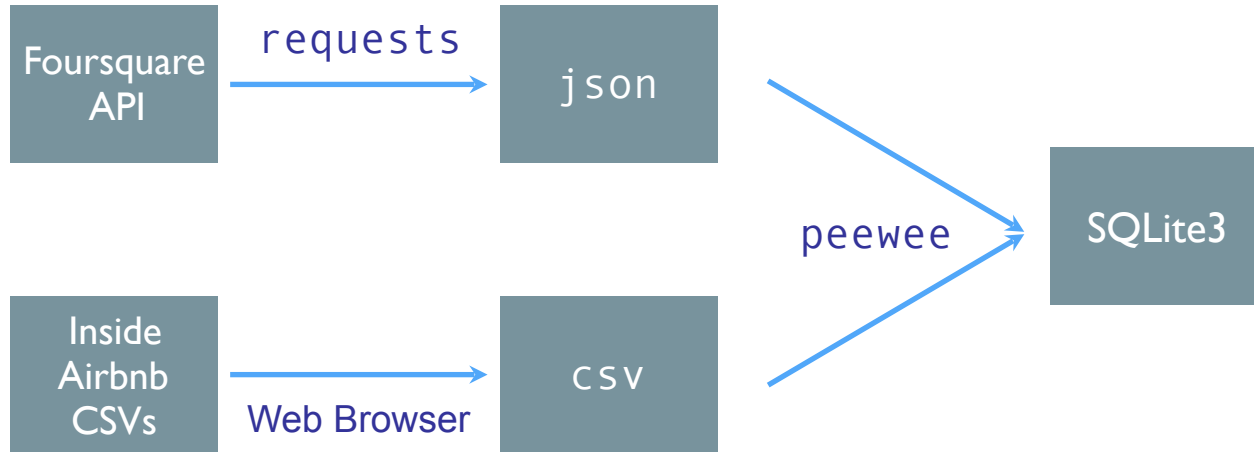
# ETL Pipeline



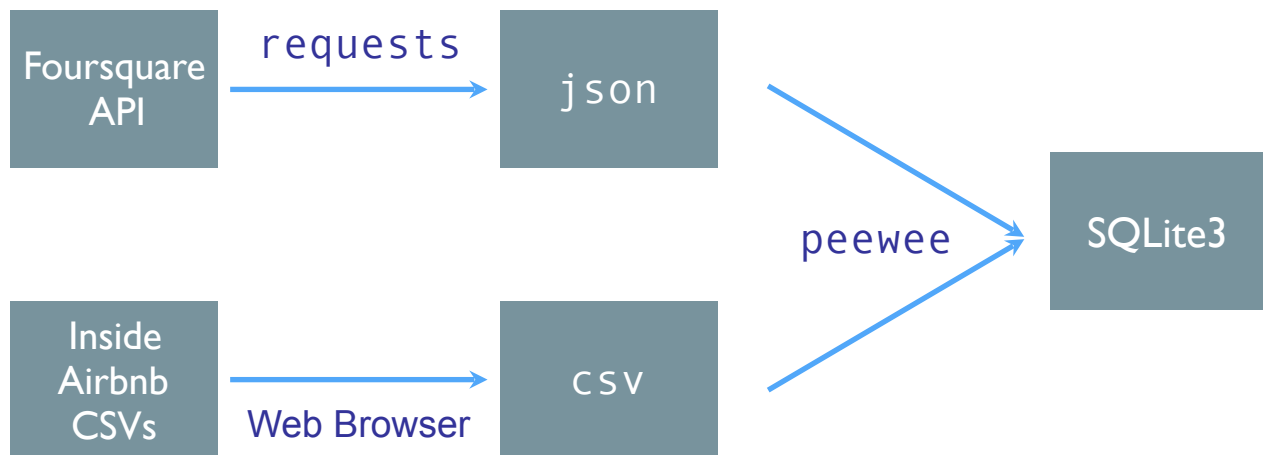
# ETL Pipeline



# ETL Pipeline

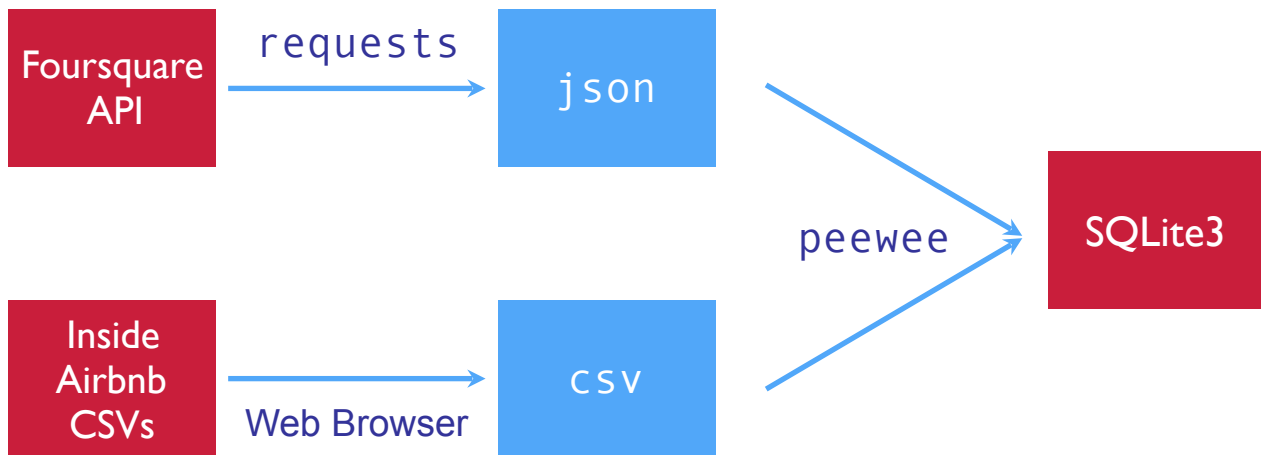


# Data Integration



# Paradigms

functional  
OOP





# Modules

functional  
OOP

