

Data Collection for Machine Learning

Week 1 · CS 203: Software Tools and Techniques for AI

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Part 1: The Motivation

Why do we need to collect data?

Imagine: You Work at Netflix

NETFLIX — Your Boss: *"We have \$500M budget for movie acquisitions. Which movies should we license?"*

The Question: Can we predict which movies will succeed?

Your Role: Data Scientist

Your Mission: Build a model to predict movie success

The Problem Statement

Goal: Predict box office revenue based on movie attributes



But wait... What features? What data? Where does it come from?

What We Need: The Target Dataset

Title	Year	Genre	Budget	Revenue	Rating	Director	Cast
Inception	2010	Sci-Fi	\$160M	\$836M	8.8	C. Nolan	DiCaprio
Avatar	2009	Action	\$237M	\$2.9B	7.9	Cameron	Worthington
The Room	2003	Drama	\$6M	\$1.9M	3.9	Wiseau	Wiseau
...

We need 10,000+ movies with complete information.

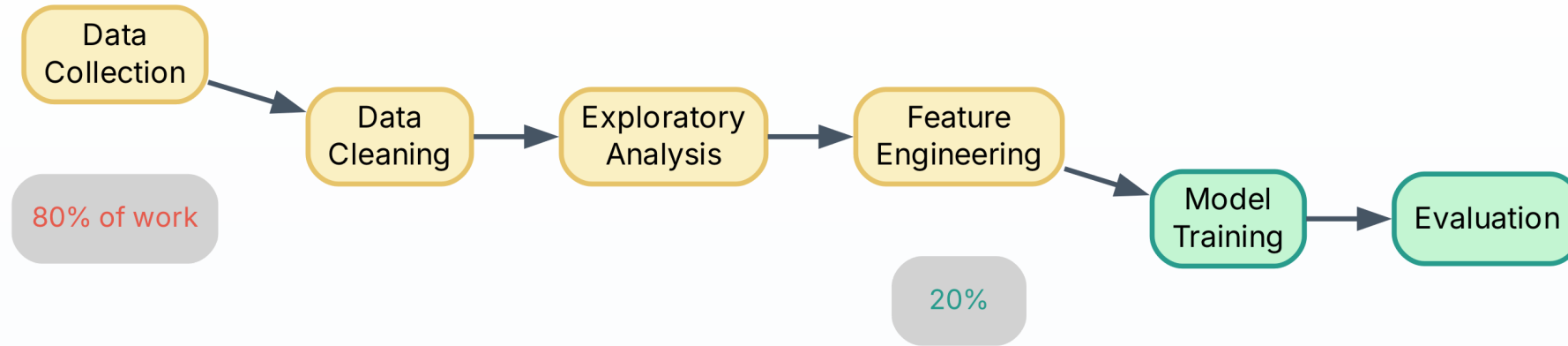
Question: Where does this data come from?

The Reality Check

- This data doesn't exist in one place
- No single CSV file with everything
- Can't just "download" the dataset
- **We must BUILD the dataset ourselves**

This is the real world of data science.

The ML Pipeline Reality



The uncomfortable truth:

- 80% of ML work is data engineering
- Models are the easy part
- **Garbage In = Garbage Out**

Why Is Data Collection So Hard?

The Data Collection Paradox: The data you need rarely exists in the form you need it.

Challenge	Example
Scattered sources	IMDb, Box Office Mojo, Rotten Tomatoes
Different formats	JSON, HTML, CSV
Missing values	Budget missing for 40% of movies
Inconsistent naming	"The Dark Knight" vs "Dark Knight, The"
Rate limits	Only 100 requests/day

Today's Mission

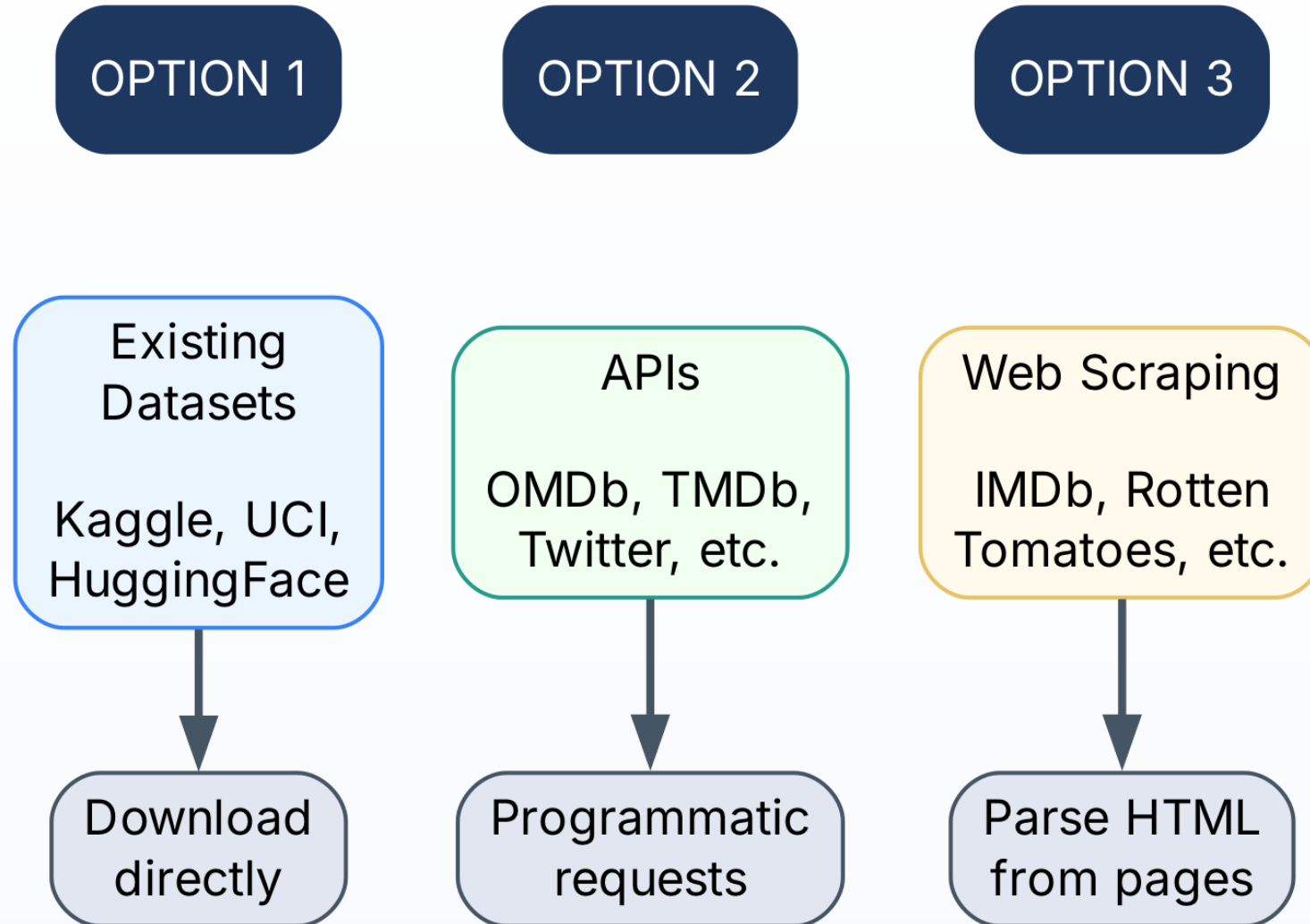
By the end of this lecture, you will know how to:

1. Find data sources for any project
2. Understand how the web works (HTTP)
3. Use Chrome DevTools to inspect network traffic
4. Make requests using curl from the command line
5. Write Python scripts with the requests library
6. Handle different data formats
7. Scrape websites when APIs don't exist

Part 2: Where Does Data Come From?

Finding the right sources

Three Ways to Get Data



Option 1: Pre-built Datasets

Where to find them:

Source	Example Datasets	Pros	Cons
Kaggle	Movies, Titanic, Housing	Ready to use, competitions	May be outdated
UCI ML Repository	Classic ML datasets	Well - documented	Academic focus
HuggingFace	NLP datasets, models	Easy loading	Specialized
Government Portals	Census, economic data	Authoritative	Limited scope

Verdict: Great starting point, but often not enough for real projects.

Option 2: APIs (Application Programming Interface)



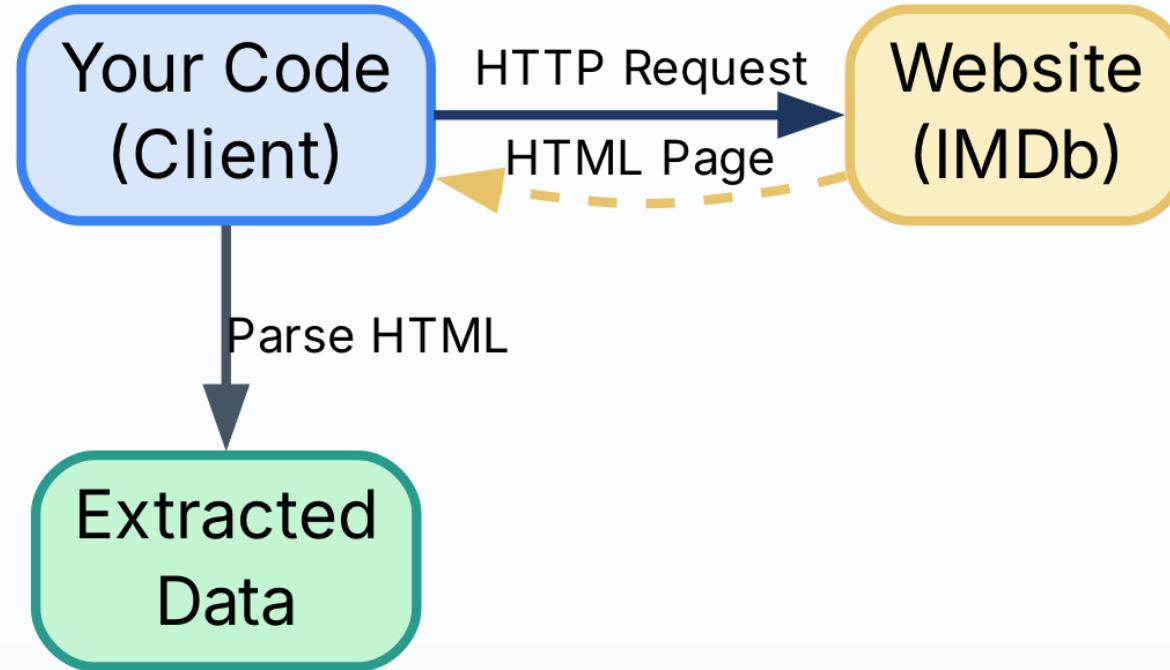
APIs = Structured way to request data from servers

Examples for our Netflix project:

- **OMDb API**: Movie metadata (title, year, ratings)
- **TMDb API**: Detailed movie info, cast, crew
- **Box Office Mojo**: Revenue data

Option 3: Web Scraping

When APIs don't exist or don't have what you need:



When to scrape: Reviews, prices, content not in APIs.

Our Strategy for Netflix Project

Data Needed	Source	Method
Movie titles, years	OMDb API	API calls
Ratings, genres	OMDb API	API calls
Budget, revenue	TMDb API	API calls
User reviews	IMDb website	Scraping
Critic reviews	Rotten Tomatoes	Scraping

Today's focus: Learn both API calls and scraping.

Decision Tree: How to Get Data

Ask these questions in order:

1. Does a ready-made dataset exist?
 - YES: Download it (Kaggle, HuggingFace)
 - NO: Continue to step 2...
2. Does an official API exist?
 - YES: Is it free/affordable? → Use the API
 - NO: Continue to step 3...

Decision Tree (continued)

3. Can you scrape the website?

- Check robots.txt and ToS first
- YES: Scrape ethically
- NO: Look for alternatives

4. None of the above?

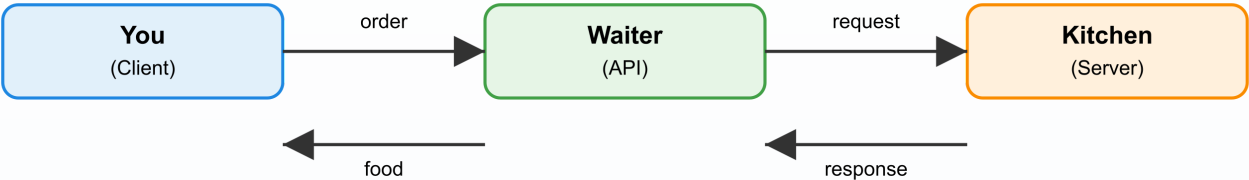
- Manual data collection
- Partner with data owner
- Reframe the problem

Most real projects use a combination of all methods!

Part 3: What is an API?

The contract between programs

API: A Restaurant Analogy



Restaurant	API
Menu	Documentation
Order	Request
Kitchen	Server
Food	Response

API: The Formal Definition

API (Application Programming Interface)

A defined set of rules and protocols for building and interacting with software applications.

```
# Without API (direct database access - dangerous!)  
SELECT * FROM movies WHERE title = 'Inception';  
  
# With API (safe, controlled access)  
GET /movies?title=Inception
```

APIs provide:

- Security (no direct DB access)
- Rate limiting (fair usage)
- Versioning (backwards compatibility)
- Documentation (how to use it)

Why Do APIs Exist?

APIs are like a bank teller window. You can't walk into the vault, but you can request transactions through a controlled interface.

Without APIs	With APIs
Anyone reads ALL data	Only expose what you want
Anyone can modify/delete	Validate every request
No tracking	Log and monitor usage
Server overwhelmed	Protect against abuse

Reading API Documentation

Before making any API call, check the docs for:

1. **Base URL** - Where do requests go?
2. **Authentication** - API key? Where does it go?
3. **Endpoints** - What resources are available?
4. **Rate limits** - How many requests per day?

Example: OMDb API Docs

Base URL: `https://www.omdbapi.com/`

Auth: `apikey` parameter in URL

Parameters: `t` (title), `i` (IMDb ID), `y` (year)

Rate limit: 1,000 requests/day (free tier)

Types of APIs

Type	Description	Example
REST API	HTTP-based, stateless, resource-oriented	OMDb, GitHub
GraphQL	Query language, get exactly what you need	GitHub v4, Shopify
SOAP	XML-based, enterprise	Legacy banking
WebSocket	Real-time, bidirectional	Chat apps, live data

For data collection, we focus on **REST APIs** (most common).

REST API: Key Principles

REST = **RE**presentational **S**tate **T**ransfer

1. **Stateless**: Server doesn't remember previous requests
2. **Resource-based**: URLs represent things (nouns)
3. **HTTP Methods**: Standard verbs (GET, POST, PUT, DELETE)
4. **Standard formats**: JSON or XML responses

Good URL Design:

GET	/movies	→ List all movies
GET	/movies/123	→ Get movie with ID 123
POST	/movies	→ Create new movie
PUT	/movies/123	→ Update movie 123
DELETE	/movies/123	→ Delete movie 123

Anatomy of an API Call

```
https://api.omdbapi.com/?apikey=abc123&t=Inception&y=2010
```

Protocol
(HTTPS)

Domain
(server)

Path
(endpoint)

Query Parameters
(key=value pairs)

Query Parameters (after the `?`):

- `apikey=abc123` → Authentication
- `t=Inception` → Movie title
- `y=2010` → Year (optional filter)

Multiple parameters joined with `&`

API Authentication

Most APIs require authentication to:

- Track usage
- Enforce rate limits
- Bill customers

Common methods:

```
# 1. API Key in URL (simplest)
```

```
GET /movies?apikey=YOUR_KEY
```

```
# 2. API Key in Header
```

```
GET /movies
```

```
X-API-Key: YOUR_KEY
```

```
# 3. Bearer Token (OAuth)
```

```
GET /movies
```

```
Authorization: Bearer YOUR_TOKEN
```

Rate Limiting

Why? Servers have limited resources.

Tier	Requests/Day
Free	100
Basic	1,000
Pro	10,000

If you exceed: HTTP 429 (Too Many Requests)

Check headers: `X-RateLimit-Remaining: 42`

Dealing with Rate Limits

Strategy 1: Simple delay

```
for movie in movies:  
    response = requests.get(api_url, params={"t": movie})  
    time.sleep(1) # Wait 1 second between requests
```

Exponential Backoff

Strategy 2: Wait longer after each failure

```
wait_time = 1
while True:
    response = requests.get(url)
    if response.status_code == 429:
        time.sleep(wait_time)
        wait_time *= 2 # Double: 1, 2, 4, 8...
    else:
        break
```

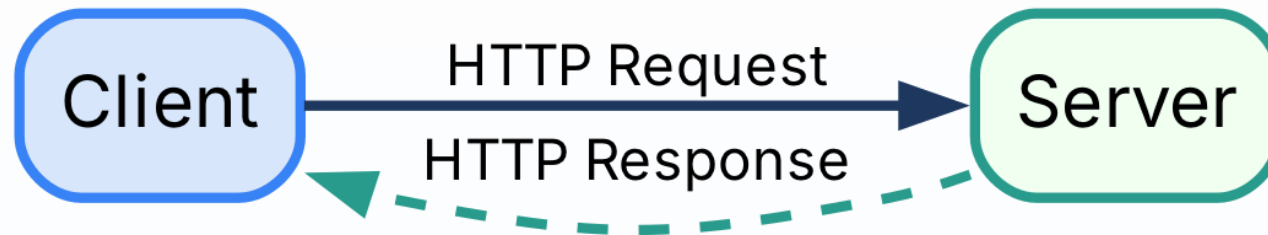
Part 4: HTTP Fundamentals

The language of the web

What is HTTP?

HTTP = **H**yper**T**ext **T**ransfer **P**rotocol

The foundation of data communication on the web.



Key characteristics:

- **Stateless**: Each request is independent
- **Text-based**: Human-readable (mostly)
- **Port 80** (HTTP) or **Port 443** (HTTPS)

Understanding "Stateless"

The Goldfish Analogy: Server forgets you after every request.

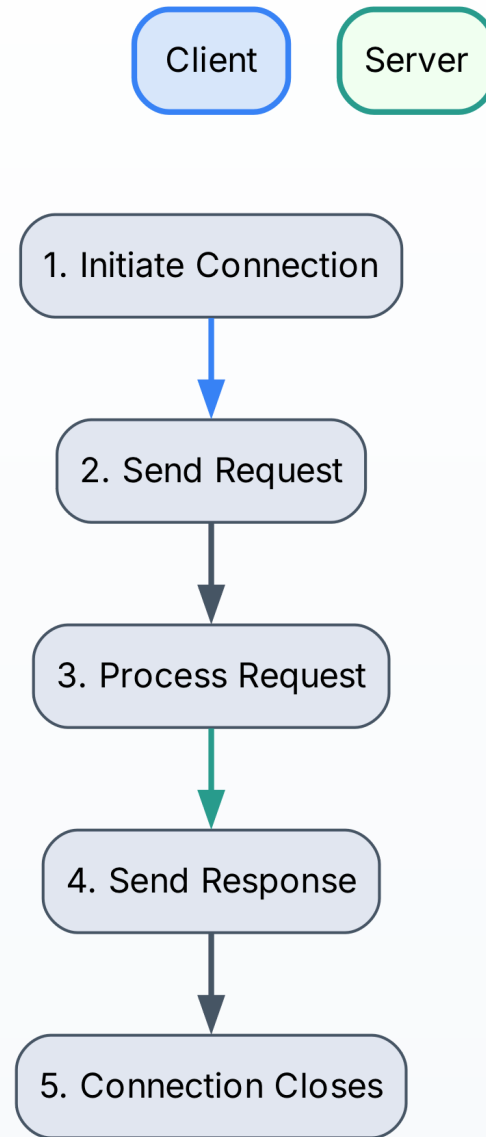
```
Request 1: "I'm Alice. Show me Inception." → "Here's data."
```

```
Request 2: "Now show me Avatar." → "Who are you?"
```

Why stateless? Scalability - any server can handle any request.

Workaround: Cookies, tokens, session IDs (sent with every request)

The Client-Server Model



HTTP Request Structure

Every HTTP request has three parts:

1. REQUEST LINE

```
GET /movies?t=Inception HTTP/1.1
```

2. HEADERS

```
Host: api.omdbapi.com
```

```
User-Agent: Python/3.9
```

```
Accept: application/json
```

```
Authorization: Bearer abc123
```

3. BODY (optional, for POST/PUT)

```
{"title": "New Movie", "year": 2024}
```

HTTP Response Structure

Every HTTP response has three parts:

1. STATUS LINE

HTTP/1.1 200 OK

2. HEADERS

Content-Type: application/json

Content-Length: 1234

X-RateLimit-Remaining: 99

3. BODY (the actual data)

```
{"Title": "Inception", "Year": "2010", ...}
```

URL Anatomy

`https://api.omdbapi.com:443/v1/movies?t=Inception&y=2010`



Component	Description	Example
Protocol	<code>http://</code> or <code>https://</code>	<code>https://</code>
Host	Domain or IP	<code>api.omdbapi.com</code>
Port	Usually implicit	443 (HTTPS)
Path	Resource location	<code>/v1/movies</code>
Query	<code>key=value</code> pairs	<code>?t=Inception</code>

Common HTTP Headers

Request Headers (what client sends):

Header	Purpose	Example
Host	Target server	api.omdbapi.com
User-Agent	Client identification	Mozilla/5.0
Accept	Preferred response format	application/json
Authorization	Authentication	Bearer token123
Content-Type	Body format (POST)	application/json

Common HTTP Headers (Response)

Response Headers (what server sends):

Header	Purpose	Example
Content-Type	Body format	application/json
Content-Length	Size in bytes	1234
Cache-Control	Caching rules	max-age=3600
X-RateLimit-Remaining	API quota left	99
Set-Cookie	Session cookie	session=abc123

Part 5: HTTP Methods - GET and POST

The two most important verbs

HTTP Methods Overview

Method	Purpose	Has Body?	Safe?	Idempotent?
GET	Retrieve data	No	Yes	Yes
POST	Create/submit data	Yes	No	No
PUT	Replace resource	Yes	No	Yes
PATCH	Partial update	Yes	No	No
DELETE	Remove resource	No	No	Yes

For data collection: 90% GET, 10% POST

What Do "Safe" and "Idempotent" Mean?

Safe = "Looking doesn't change anything" (like window shopping)

Idempotent = "Doing it twice has the same effect as once"

Action	Safe?	Idempotent?
Reading a book	Yes	Yes
Ordering pizza	No	No
Setting thermostat to 72°	No	Yes

Why this matters:

- GET can be cached and retried safely
- POST should not be auto-retried (double-charge risk!)

GET Request: Retrieving Data

Purpose: Fetch data without modifying anything.

```
GET /movies?t=Inception&y=2010 HTTP/1.1
Host: api.omdbapi.com
Accept: application/json
```

Characteristics:

- Parameters in URL (query string)
- No request body
- **Safe:** Doesn't change server state
- **Idempotent:** Same request = same result
- **Cacheable:** Responses can be cached

POST Request: Sending Data

Purpose: Submit data to create or process something.

```
POST /api/feedback HTTP/1.1
Host: example.com
Content-Type: application/json

{"movie_id": 123, "rating": 5, "review": "Great!"}
```

Characteristics:

- Data in request body (not URL)
- **Not safe:** Modifies server state
- **Not idempotent:** Multiple POSTs create multiple resources
- **Not cacheable**

GET vs POST: When to Use Which

Scenario	Method	Why
Fetching movie details	GET	Retrieving data
Searching for movies	GET	Query in URL
Submitting a review	POST	Creating new data
Uploading an image	POST	Sending binary data
User login	POST	Sensitive data in body
Listing all movies	GET	No modification

Data Collection = Mostly GET

Data Submission = POST

HTTP Status Codes

Status codes are grouped by category:

Range	Category	Meaning
1xx	Informational	Request received, processing
2xx	Success	Request succeeded
3xx	Redirection	Further action needed
4xx	Client Error	Your fault
5xx	Server Error	Their fault

Common Status Codes

Code	Meaning	When
200 OK	Success	Request succeeded
201 Created	Created	POST created resource
400 Bad Request	Client error	Malformed request
401 Unauthorized	Auth needed	Missing credentials
403 Forbidden	Denied	Not allowed
404 Not Found	Missing	Resource doesn't exist
429 Too Many Requests	Rate limit	Slow down!
500 Internal Error	Server crash	Their fault

Status Code Intuition

First digit = who's to blame: 2xx = OK, 4xx = your fault, 5xx = their fault

```
if response.status_code == 200:
    data = response.json()      # Success!
elif response.status_code == 404:
    print("Not found")         # Bad ID
elif response.status_code == 429:
    time.sleep(60)             # Rate limited
elif response.status_code >= 500:
    time.sleep(5)              # Server error
```


Part 6: Response Formats

Same data, different representations

Why Different Formats?

Same movie data can be represented in different formats:

Format	Full Name	Use Case
JSON	JavaScript Object Notation	APIs, Web apps
XML	eXtensible Markup Language	Enterprise, Legacy
CSV	Comma Separated Values	Spreadsheets, ML
HTML	HyperText Markup Language	Web pages
Protobuf	Protocol Buffers	High-performance

Content-Type header tells you the format:

- `application/json` → JSON
- `application/xml` → XML
- `text/html` → HTML
- `text/csv` → CSV

Format 1: JSON

The most common API format today.

```
{
  "title": "Inception",
  "year": 2010,
  "genres": ["Sci-Fi", "Action", "Thriller"],
  "director": {
    "name": "Christopher Nolan",
    "nationality": "British"
  },
  "rating": 8.8,
  "in_production": false
}
```

Pros: Human-readable, lightweight, native to JavaScript

Cons: No schema validation, no comments

JSON Data Types

```
{  
  "string": "Hello World",  
  "number": 42,  
  "decimal": 3.14159,  
  "boolean": true,  
  "null_value": null,  
  "array": [1, 2, 3],  
  "object": {  
    "nested": "value"  
  }  
}
```

Only 7 data types: string, number, boolean, null, array, object

Note: No native date type! Dates are typically strings: "2010-07-16"

JSON Gotchas

```
# Numbers might be strings!
data = {"year": "2010"}      # String, not int!
year = int(data["year"])    # Must convert

# Missing keys crash your code
data["director"]             # KeyError!
data.get("director", "Unknown") # Safe!
```

More JSON Gotchas

```
# null becomes None in Python
data = {"budget": None}
if data["budget"]:           # This is False!
    print("Has budget")

# Empty string vs null vs missing
{"rating": ""}              # Empty string
{"rating": None}            # Null
{}                          # Missing key
```

Format 2: XML

The enterprise standard (still used in SOAP APIs).

```
<?xml version="1.0" encoding="UTF-8"?>
<movie>
  <title>Inception</title>
  <year>2010</year>
  <genres>
    <genre>Sci-Fi</genre>
    <genre>Action</genre>
  </genres>
  <director nationality="British">
    Christopher Nolan
  </director>
  <rating>8.8</rating>
</movie>
```

Pros: Schema validation (XSD), attributes, widespread support

Cons: Verbose, heavier than JSON

JSON vs XML: Same Data

Aspect	JSON	XML
Syntax	<code>{"name": "Inception"}</code>	<code><name>Inception</name></code>
Structure	Curly braces <code>{}</code>	Tags <code><tag></tag></code>
Size	Lighter (~30% smaller)	More verbose
Attributes	Not supported	Supported
Arrays	<code>[1, 2, 3]</code>	Repeated elements
Usage	Modern APIs	Legacy/Enterprise

Format 3: CSV

The data scientist's friend.

```
title,year,genre,director,rating  
Inception,2010,Sci-Fi,Christopher Nolan,8.8  
Avatar,2009,Action,James Cameron,7.9
```

Pros: Opens in Excel, easy pandas loading, very compact

Cons: Flat structure only, no data types, escaping issues

Format 4: HTML

What you get when scraping websites.

```
<div class="movie-card">
  <h2 class="title">Inception</h2>
  <span class="year">2010</span>
  <ul class="genres">
    <li>Sci-Fi</li>
    <li>Action</li>
  </ul>
  <p class="rating">Rating: 8.8/10</p>
</div>
```

Not designed for data exchange!

- Mixed with presentation (CSS, layout)
- Need to parse and extract relevant data
- Structure varies by website

Format 5: Protocol Buffers (Protobuf)

Google's high-performance binary format.

```
// movie.proto (schema definition)
message Movie {
  string title = 1;
  int32 year = 2;
  repeated string genres = 3;
  float rating = 4;
}
```

Binary on the wire (not human-readable):

```
0a 09 49 6e 63 65 70 74 69 6f 6e 10 da 0f ...
```

Pros: 10x smaller, 100x faster parsing

Cons: Need schema, binary format, requires tooling

Format Comparison: Same Movie

Format	Size	Readability	Use Case
JSON	150 bytes	High	REST APIs
XML	200 bytes	Medium	Enterprise
CSV	50 bytes	High	Data exchange
HTML	300 bytes	Low	Web pages
Protobuf	30 bytes	None	High -perf APIs

For this course: Focus on JSON and HTML

Part 7: Chrome DevTools

Your window into HTTP traffic

Why Chrome DevTools?

DevTools lets you see:

- Every HTTP request your browser makes
- Request headers, body, timing
- Response headers, body, status codes
- Copy requests as curl commands!

This is how you learn what APIs a website uses.

Opening DevTools

Three ways to open:

1. **Keyboard:** `F12` or `Ctrl+Shift+I` (Windows/Linux) / `Cmd+Option+I` (Mac)
2. **Right-click:** Right-click on page → "Inspect"
3. **Menu:** Chrome menu → More Tools → Developer Tools

Navigate to the "Network" tab

The Network Tab

Network				
[*] Preserve log [] Disable cache [Filter]				
Name	Status	Type	Size	Time
api/movies	200	fetch	1.2 KB	45 ms
styles.css	200	css	5.4 KB	23 ms
logo.png	200	image	15 KB	67 ms
analytics.js	200	script	8.1 KB	89 ms

Every row = one HTTP request/response

Filtering Requests

Filter by type:

Filter	Shows
All	Everything
Fetch/XHR	API calls (AJAX) ← Most useful!
Doc	HTML documents
CSS	Stylesheets
JS	JavaScript files
Img	Images

Click "Fetch/XHR" to see only API calls

Inspecting a Request

Click on any request to see details:

Headers	Preview	Response	Timing	Cookies
General:				
Request URL: <code>https://api.example.com/movies?id=123</code>				
Request Method: GET				
Status Code: 200 OK				
Response Headers:				
content-type: application/json				
x-ratelimit-remaining: 99				
Request Headers:				
authorization: Bearer eyJhbGc...				
user-agent: Mozilla/5.0...				

The Preview & Response Tabs

Preview Tab: Formatted JSON viewer

```
{  
  "title": "Inception",  
  "year": 2010,  
  "rating": 8.8  
}
```

Response Tab: Raw response body

```
{"title":"Inception","year":2010,"rating":8.8}
```

Copy as curl

The most powerful feature!

1. Right-click on any request
2. Select "Copy" → "Copy as cURL"
3. Paste into terminal

```
curl 'https://api.example.com/movies?id=123' \  
  -H 'accept: application/json' \  
  -H 'authorization: Bearer eyJhbGciOiJIUzI1...' \  
  -H 'user-agent: Mozilla/5.0 (Macintosh...)' \  
  --compressed
```

Now you can replay the exact request from your terminal!

Demo: Finding Hidden APIs

Many websites use hidden APIs. Here's how to find them:

1. Open DevTools → Network tab
2. Filter by "Fetch/XHR"
3. Interact with the website (search, click, load more)
4. Watch for API calls appearing in the list
5. Click on interesting requests to inspect them
6. Copy as curl to test in terminal

Example: Search on IMDb and watch for API calls...

DevTools Pro Tips

Preserve log: Keep requests when navigating between pages

Disable cache: See fresh requests every time

Search: `Ctrl+F` to search in all requests

Filter by URL: Type in filter box to match URLs

Clear: Click the clear icon to clear all requests

Throttling: Simulate slow networks (3G, offline)

Part 8: Making Requests with curl

The command-line HTTP client

What is curl?

curl = "Client URL" - a command-line tool for transferring data.

```
# Your first curl command  
curl "https://api.omdbapi.com/?apikey=demo&t=Inception"
```

Why learn curl?

- Universal (works everywhere)
- Quick debugging
- Foundation for understanding HTTP
- Copy from DevTools, paste and run

curl: Basic Syntax

```
curl [options] [URL]
```

Common options:

Option	Meaning	Example
-X	HTTP method	-X POST
-H	Add header	-H "Accept: application/json"
-d	Send data (body)	-d '{"key": "value"}'
-o	Output to file	-o movie.json
-I	Headers only	-I
-v	Verbose output	-v
-s	Silent mode	-s

curl: GET Request

```
# Simple GET request  
curl "https://api.omdbapi.com/?apikey=demo&t=Inception"
```

Output:

```
{"Title":"Inception","Year":"2010","Rated":"PG-13",  
"Released":"16 Jul 2010","Runtime":"148 min",...}
```

Important: Quote the URL! (prevents shell interpretation of `&`)

curl: Adding Headers

```
curl "https://api.example.com/movies" \  
  -H "Accept: application/json" \  
  -H "Authorization: Bearer YOUR_TOKEN" \  
  -H "User-Agent: MyApp/1.0"
```

Common headers to add:

- `Accept: application/json` - Request JSON response
- `Authorization: Bearer TOKEN` - Authentication
- `Content-Type: application/json` - When sending JSON

curl: Viewing Response Headers

```
# Show only response headers (no body)
curl -I "https://api.omdbapi.com/?apikey=demo&t=Inception"
```

Output:

```
HTTP/1.1 200 OK
Content-Type: application/json; charset=utf-8
Content-Length: 1024
Cache-Control: public, max-age=86400
X-RateLimit-Remaining: 999
```

curl: Verbose Mode

```
curl -v "https://api.omdbapi.com/?apikey=demo&t=Inception"
```

Shows everything (request AND response):

```
> GET /?apikey=demo&t=Inception HTTP/2
> Host: api.omdbapi.com
> User-Agent: curl/7.79.1
> Accept: */*
>
< HTTP/2 200
< content-type: application/json
< content-length: 1024
<
{"Title":"Inception"...}
```

> = What you sent (request)

< = What you received (response)

Pretty Printing with jq

Raw JSON is hard to read. Pipe to `jq` for formatting:

```
curl -s "https://api.omdbapi.com/?apikey=demo&t=Inception" | jq .
```

Output (formatted):

```
{
  "Title": "Inception",
  "Year": "2010",
  "Rated": "PG-13",
  "Runtime": "148 min",
  "Genre": "Action, Adventure, Sci-Fi"
}
```

jq: Extracting Specific Fields

```
# Get just the title
```

```
curl -s ... | jq '.Title'
```

```
# Output: "Inception"
```

```
# Get multiple fields as new object
```

```
curl -s ... | jq '{title: .Title, year: .Year, rating: .imdbRating}'
```

```
# Output: {"title": "Inception", "year": "2010", "rating": "8.8"}
```

```
# Get first element of array
```

```
curl -s ... | jq '.Search[0]'
```

```
# Get all titles from array
```

```
curl -s ... | jq '.Search[].Title'
```

curl: Saving to File

```
# Save response to file
```

```
curl "https://api.omdbapi.com/?apikey=demo&t=Inception" \  
  -o inception.json
```

```
# Silent mode (no progress bar)
```

```
curl -s "https://api.example.com/data" -o output.json
```

```
# Save with pretty formatting
```

```
curl -s ... | jq . > formatted.json
```


curl: POST Request

```
curl -X POST "https://api.example.com/reviews" \  
  -H "Content-Type: application/json" \  
  -H "Authorization: Bearer YOUR_TOKEN" \  
  -d '{"movie_id": 123, "rating": 5, "review": "Amazing!"}'
```

Components:

- `-X POST` - Use POST method
- `-H "Content-Type: application/json"` - Tell server we're sending JSON
- `-d '...'` - The data (request body)

curl: POST with Form Data

```
# Form-encoded data (like HTML forms)
```

```
curl -X POST "https://example.com/login" \  
  -d "username=john" \  
  -d "password=secret"
```

```
# Equivalent to:
```

```
curl -X POST "https://example.com/login" \  
  -H "Content-Type: application/x-www-form-urlencoded" \  
  -d "username=john&password=secret"
```

curl: File Upload

```
# Upload a file
curl -X POST "https://api.example.com/upload" \
  -F "file=@/path/to/image.jpg" \
  -F "description=My photo"
```

-F = multipart form data (for file uploads)

@ = read from file

curl: Useful Options

Retry on failure

```
curl --retry 3 "https://api.example.com/data"
```

Set timeout (seconds)

```
curl --max-time 10 "https://api.example.com/slow"
```

Follow redirects

```
curl -L "https://short.url/abc"
```

Fail silently on HTTP errors

```
curl -f "https://api.example.com/notfound"
```

(exits with error code instead of showing error page)

Part 9: Python requests Library

Programmatic data collection

Why Python requests?

curl is great for testing, but for automation you need Python.

```
# Install  
pip install requests
```

Benefits over curl:

- Loop over many URLs
- Parse JSON automatically
- Handle errors gracefully
- Store data in variables
- Integrate with pandas, ML pipelines

requests: Simple GET

```
import requests

# Make the request
response = requests.get(
    "https://api.omdbapi.com/",
    params={"apikey": "demo", "t": "Inception"}
)

# Check status
print(response.status_code)  # 200

# Get JSON data
data = response.json()
print(data["Title"])  # "Inception"
print(data["Year"])  # "2010"
```

requests: Using params

Don't manually build query strings!

```
# Bad (manual string building)
url = "https://api.omdbapi.com/?apikey=demo&t=Inception&y=2010"

# Good (use params dict)
response = requests.get(
    "https://api.omdbapi.com/",
    params={
        "apikey": "demo",
        "t": "Inception",
        "y": 2010
    }
)
```

Python handles URL encoding automatically!

requests: Adding Headers

```
response = requests.get(
    "https://api.example.com/movies",
    headers={
        "Authorization": "Bearer YOUR_TOKEN",
        "Accept": "application/json",
        "User-Agent": "MyApp/1.0"
    }
)
```

requests: Response Object

```
response = requests.get("https://api.omdbapi.com/...")

# Status code
response.status_code      # 200

# Headers (dict-like)
response.headers["Content-Type"]  # "application/json"

# Body as text
response.text             # '{"Title": "Inception"...}'

# Body as JSON (parsed dict)
response.json()           # {"Title": "Inception", ...}

# Was it successful?
response.ok               # True (for 2xx status codes)
```

requests: POST with JSON

```
import requests

response = requests.post(
    "https://api.example.com/reviews",
    headers={
        "Authorization": "Bearer YOUR_TOKEN"
    },
    json={ # Use json= for automatic JSON encoding
        "movie_id": 123,
        "rating": 5,
        "review": "Great movie!"
    }
)

if response.status_code == 201:
    print("Review submitted!")
    print(response.json())
```

requests: POST with Form Data

```
# Form-encoded POST (like HTML forms)
response = requests.post(
    "https://example.com/login",
    data={ # Use data= for form encoding
        "username": "john",
        "password": "secret"
    }
)
```

Remember:

- `json=` → Content-Type: application/json
- `data=` → Content-Type: application/x-www-form-urlencoded

requests: Error Handling

```
try:
    response = requests.get(url, params=params, timeout=10)
    response.raise_for_status() # Raise for 4xx/5xx
    data = response.json()
except requests.exceptions.Timeout:
    print("Request timed out")
except requests.exceptions.HTTPError as e:
    print(f"HTTP error: {e}")
except requests.exceptions.RequestException as e:
    print(f"Request failed: {e}")
```

Key points:

- Always set `timeout` to avoid hanging
- `raise_for_status()` converts bad status codes to exceptions

requests: Looping Over Multiple Items

```
import requests
import time

movies = ["Inception", "Avatar", "The Matrix", "Interstellar"]
results = []

for title in movies:
    response = requests.get(
        "https://api.omdbapi.com/",
        params={"apikey": "YOUR_KEY", "t": title}
    )

    if response.ok:
        results.append(response.json())
        print(f"Got: {title}")

    time.sleep(0.5) # Be nice to the server!

print(f"Collected {len(results)} movies")
```

requests: Session for Multiple Requests

```
import requests

# Session persists settings across requests
session = requests.Session()
session.headers.update({
    "Authorization": "Bearer YOUR_TOKEN",
    "User-Agent": "MyApp/1.0"
})

# Now all requests use these headers
r1 = session.get("https://api.example.com/movies")
r2 = session.get("https://api.example.com/reviews")
r3 = session.get("https://api.example.com/users")

# Also maintains cookies automatically!
```

requests: Practical Example

```
def fetch_movie_data(titles, api_key):
    """Fetch movie data for a list of titles."""
    movies = []
    for title in titles:
        response = requests.get(
            "https://api.omdbapi.com/",
            params={"apikey": api_key, "t": title},
            timeout=10
        )
        if response.ok and response.json().get("Response") == "True":
            movies.append(response.json())
    return pd.DataFrame(movies)

df = fetch_movie_data(["Inception", "Avatar"], "YOUR_KEY")
```


Data Collection Best Practices

1. **Save raw responses** - Save the full JSON, not just extracted fields
2. **Log everything** - Track successes, failures, and why
3. **Use checkpoints** - Resume after crashes
4. **Handle edge cases** - Missing budgets, directors, etc.
5. **Validate as you go** - Check data types early

Why? Don't re-collect 10,000 movies because you missed a field!

curl vs requests: Comparison

Aspect	curl	Python requests
Use case	Quick testing	Automation
Learning	Interactive exploration	Production code
Looping	Bash scripts	Native Python
JSON parsing	Needs jq	Built-in .json()
Error handling	Exit codes	Exceptions
DevTools	Copy as curl (yes)	Convert from curl

Workflow: DevTools → Copy as curl → Test → Convert to Python

Part 10: Web Scraping

When APIs don't exist

When to Scrape?

DO scrape when:

- No API available
- API doesn't have the data you need
- API is too expensive
- Public information on public websites

DON'T scrape when:

- robots.txt disallows it
- Terms of Service prohibit it
- Data is behind login (personal data)
- It would harm the website

API vs Scraping Comparison

Aspect	API	Scraping
Reliability	Stable	Fragile (HTML changes)
Speed	Fast	Slower
Data Format	Structured JSON	Unstructured HTML
Rate Limits	Documented	Unknown
Legality	Clear TOS	Gray area
Maintenance	Low	High

Rule: Always prefer APIs when available.

HTML Structure Basics

HTML = Nested elements forming a tree (DOM)

```
<!DOCTYPE html>
<html>
  <head>
    <title>Movie Database</title>
  </head>
  <body>
    <div class="movie" id="movie-123">
      <h2 class="title">Inception</h2>
      <span class="year">2010</span>
      <p class="plot">A thief who steals...</p>
    </div>
  </body>
</html>
```

The DOM Tree

```
      html
     /  \
    head body
    |    |
    title div.movie
         /  |  \
        h2.title span.year p.plot
         |         |         |
        "Inception" "2010" "A thief..."
```

DOM = Document Object Model

Scraping = Navigating this tree to extract data

CSS Selectors: Finding Elements

Selector	Meaning	Example Match
<code>div</code>	Element type	<code><div>...</div></code>
<code>.movie</code>	Class name	<code><div class="movie"></code>
<code>#main</code>	Element ID	<code><div id="main"></code>
<code>div.movie</code>	Tag with class	<code><div class="movie"></code>
<code>.movie .title</code>	Nested element	<code>.title</code> inside <code>.movie</code>
<code>a[href="/movies"]</code>	Attribute value	<code></code>

BeautifulSoup: Setup

```
pip install beautifulsoup4 requests
```

```
from bs4 import BeautifulSoup
import requests

# Fetch the page
response = requests.get("https://example.com/movies")
html = response.text

# Parse it
soup = BeautifulSoup(html, 'html.parser')

# Now we can search!
```

BeautifulSoup: Finding Elements

```
from bs4 import BeautifulSoup

html = """
<div class="movie">
  <h2 class="title">Inception</h2>
  <span class="year">2010</span>
  <span class="rating">8.8</span>
</div>
"""

soup = BeautifulSoup(html, 'html.parser')

# Find single element
title = soup.find('h2', class_='title')
print(title.text) # "Inception"

# Find all elements
all_movies = soup.find_all('div', class_='movie')
```

BeautifulSoup: CSS Selectors

```
soup = BeautifulSoup(html, 'html.parser')

# Select first match
title = soup.select_one('.movie .title')
print(title.text) # "Inception"

# Select all matches
all_titles = soup.select('.movie .title')
for t in all_titles:
    print(t.text)

# Complex selectors
links = soup.select('a[href^="/movies/"]') # href starts with
```

BeautifulSoup: Extracting Data

```
# Get text content
element.text          # "Inception"
element.get_text()    # Same, with options
element.get_text(strip=True) # Remove whitespace

# Get attribute
link = soup.select_one('a')
link.get('href')       # "/movies/123"
link['href']           # Same thing

# Get all attributes
link.attrs             # {'href': '/movies/123', 'class': ['btn']}
```

Scraping Example: Movie List

```
from bs4 import BeautifulSoup
import requests

response = requests.get("https://example.com/top-movies")
soup = BeautifulSoup(response.text, 'html.parser')

movies = []
for card in soup.select('.movie-card'):
    movie = {
        'title': card.select_one('.title').text.strip(),
        'year': card.select_one('.year').text.strip(),
        'rating': card.select_one('.rating').text.strip(),
    }
    movies.append(movie)
```

Handling Pagination

```
base_url = "https://example.com/movies?page="
all_movies = []

for page in range(1, 11): # Pages 1-10
    response = requests.get(f"{base_url}{page}")
    soup = BeautifulSoup(response.text, 'html.parser')

    movies = soup.select('.movie-card')
    if not movies:
        break # No more pages

    for m in movies:
        all_movies.append(m.select_one('.title').text)

    time.sleep(1) # Be polite!
```

Scraping Ethics & Best Practices

```
headers = {'User-Agent': 'MyBot/1.0 (contact@example.com)'}

for url in urls:
    response = requests.get(url, headers=headers)
    time.sleep(1) # Wait between requests
```

Rules:

1. Check `robots.txt` first
2. Add delays between requests
3. Identify yourself (User-Agent)
4. Cache responses when possible
5. Respect rate limits

Common Scraping Mistakes

Mistake	Solution
No delays	Add <code>time.sleep(1)</code>
Hardcoded selectors	Handle missing elements
No error handling	Wrap in try/except
Ignoring encoding	Check <code>response.encoding</code>
Not saving raw HTML	Save before parsing

Defensive Scraping Pattern

```
try:
    title = card.select_one('.title')
    movie['title'] = title.text.strip() if title else "Unknown"
except Exception as e:
    logging.error(f"Failed to parse: {url}, error: {e}")
```

Always handle missing elements gracefully!

Checking robots.txt

```
curl https://www.imdb.com/robots.txt
```

```
User-agent: *  
Disallow: /search/  
Disallow: /ap/  
Allow: /title/  
Crawl-delay: 1
```

Meaning:

- Cannot scrape `/search/` pages
- Can scrape `/title/` pages (movie pages)
- Wait 1 second between requests

Part 11: Putting It All Together

Back to our Netflix mission

Remember Our Goal?

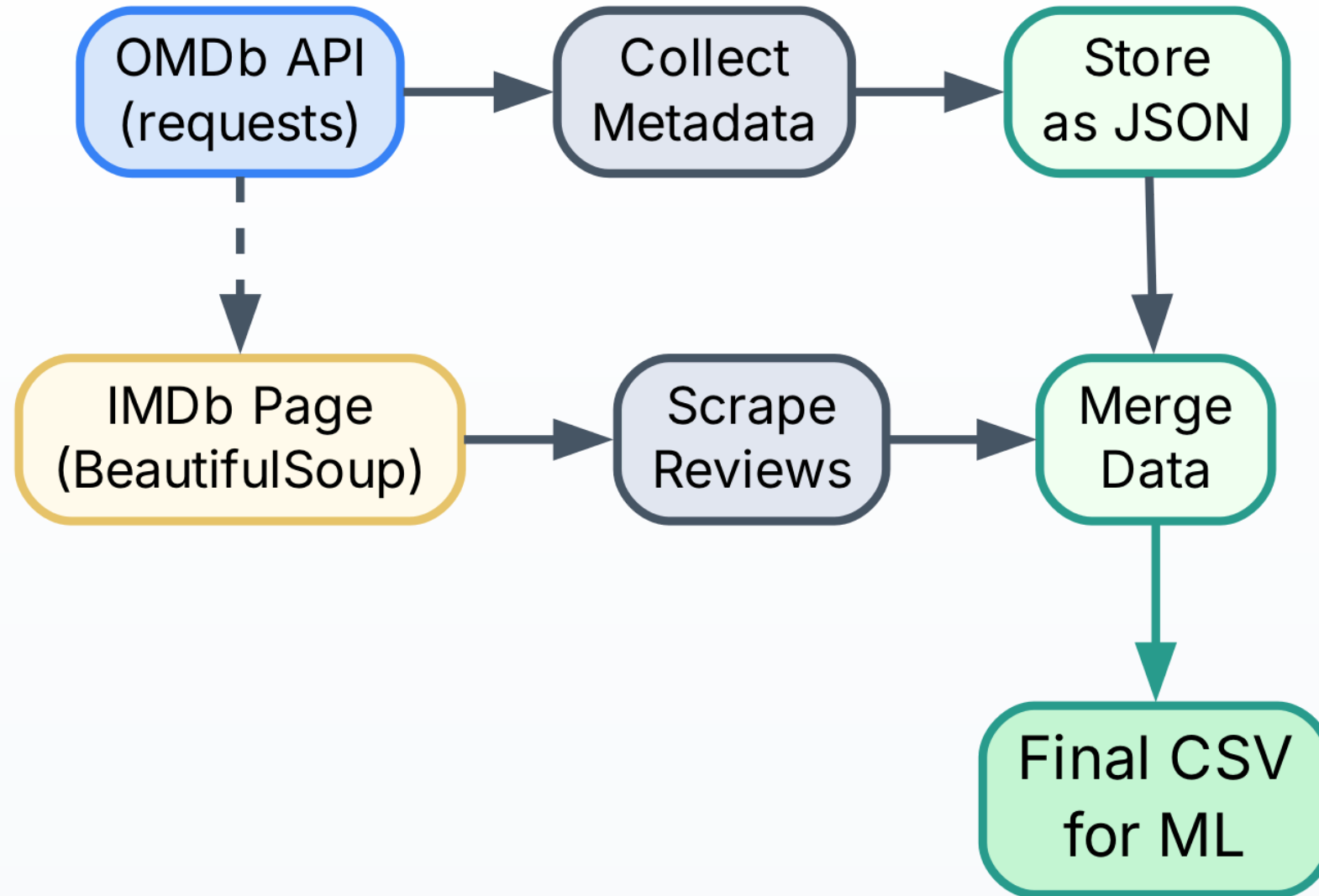
Build a dataset for movie success prediction:

Title	Year	Genre	Budget	Revenue	Rating	Director
?	?	?	?	?	?	?

We now have the tools!

- **DevTools** to find APIs
- **curl** to test requests
- **requests** to automate collection
- **BeautifulSoup** for scraping

Our Data Collection Pipeline



Step 1: Collect from API

```
import requests
import time

API_KEY = "your_omdb_key"
movies_to_fetch = ["Inception", "Avatar", "The Matrix"]
results = []

for title in movies_to_fetch:
    response = requests.get(
        "https://api.omdbapi.com/",
        params={"apikey": API_KEY, "t": title}
    )

    if response.ok:
        data = response.json()
        if data.get("Response") == "True":
            results.append(data)

    time.sleep(0.5) # Rate limiting

print(f"Collected {len(results)} movies")
```

Step 2: Extract Relevant Fields

```
movies = []

for data in results:
    movie = {
        "title": data.get("Title"),
        "year": data.get("Year"),
        "genre": data.get("Genre"),
        "director": data.get("Director"),
        "rating": data.get("imdbRating"),
        "votes": data.get("imdbVotes"),
        "runtime": data.get("Runtime"),
        "imdb_id": data.get("imdbID")
    }
    movies.append(movie)
```

Step 3: Save to CSV

```
import pandas as pd

# Convert to DataFrame
df = pd.DataFrame(movies)

# Clean data
df['year'] = pd.to_numeric(df['year'], errors='coerce')
df['rating'] = pd.to_numeric(df['rating'], errors='coerce')
df['votes'] = df['votes'].str.replace(',', '').astype(float)

# Save
df.to_csv('netflix_movie_data.csv', index=False)

print(df.head())
```


The Result

```
   title  year      genre      director  rating
0  Inception  2010  Action, Adventure... Christopher Nolan    8.8
1    Avatar  2009  Action, Adventure...   James Cameron    7.9
2 The Matrix  1999  Action, Sci-Fi    Lana Wachowski...    8.7
```

Now ready for ML modeling!

What We Learned: Three Tools

Tool	When to Use	Key Commands
Chrome DevTools	Discover APIs, inspect requests	Network tab, Copy as curl
curl	Test requests quickly	<code>-X</code> , <code>-H</code> , <code>-d</code> , `
Python requests	Automate collection	<code>.get()</code> , <code>.post()</code> , <code>.json()</code>

Plus BeautifulSoup for scraping when needed!

Part 12: Looking Ahead

Lab preview and next week

This Week's Lab

Hands-on Practice:

1. **Chrome DevTools** - Inspect API calls on real websites
2. **curl exercises** - Making API requests from terminal
3. **OMDb API** - Collecting movie metadata
4. **Python requests** - Building a data collection script
5. **BeautifulSoup** - Scraping a sample website

Goal: Build a working data collection pipeline.

Lab Environment Setup

```
# Install dependencies
pip install requests beautifulsoup4 pandas

# Get your API keys
# OMDb: https://www.omdbapi.com/apikey.aspx (free tier)

# Verify installation
python -c "import requests; print('Ready!')"
```

Next Week Preview

Week 2: Data Validation & Cleaning

- Schema validation with Pydantic
- Handling missing data
- Type conversion and normalization
- Data quality checks
- Building validation pipelines

The data we collect today needs cleaning tomorrow!

Key Takeaways

1. **Data collection is 80% of ML work** - don't underestimate it
2. **DevTools reveals hidden APIs** - always check before scraping
3. **curl for quick testing** - then convert to Python
4. **requests for automation** - handle loops, errors, storage
5. **Scraping is plan B** - use when APIs don't exist
6. **Be ethical** - respect robots.txt, rate limits, ToS

Resources

Documentation:

- curl: <https://curl.se/docs/>
- requests: <https://requests.readthedocs.io/>
- BeautifulSoup: <https://beautiful-soup-4.readthedocs.io/>

Free APIs for Practice:

- JSONPlaceholder: <https://jsonplaceholder.typicode.com/>
- OMDb: <https://www.omdbapi.com/>
- Public APIs list: <https://github.com/public-apis/public-apis>

Questions?

Thank You!

See you in the lab!