



**Institute** of  
**Data**

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2021



# Data Science and AI

Module 2

Part 2:

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APIs

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# Agenda: Module 2 Part 2

- What is an API?
- APIs for data services
- APIs for analytic services
- APIs for visualisation services
- APIs for cognitive services
- Creating an API



# What is an API?

- Definition, examples
- Interfaces
- Authentication protocols
- Documentation



# What is an API?

- What does “API” stand for?
  - Application Programming Interface
- Examples?
  - automation in Microsoft Office
    - e.g. generating a Word document or an Outlook reminder from another application
  - high-level database drivers
    - e.g. PyMongo
  - programming libraries for mobile & wearable devices
  - programmable web services
  - other?



# Use Cases for APIs

- integrate remote data access
  - repetitive analyses of an **evolving dataset**
  - **up-to-the-moment** forecasting
- **integrate** familiar functionality
  - location sharing using Google Maps
  - simplified app login via Facebook
  - in-app purchases
  - in-app YouTube viewing





# Some Popular Web Service APIs

Name	Nature	URL
Twitter	Networking, marketing, trending	<a href="https://developer.twitter.com/en.html">https://developer.twitter.com/en.html</a>
Facebook	Networking, marketing	<a href="https://developers.facebook.com/tools/">https://developers.facebook.com/tools/</a>
Amazon S3	Cloud storage, Big Data analytics	<a href="https://aws.amazon.com/s3/">https://aws.amazon.com/s3/</a>
LinkedIn	Networking	<a href="https://developer.linkedin.com/">https://developer.linkedin.com/</a>
eBay	E-commerce	<a href="https://developer.ebay.com/">https://developer.ebay.com/</a>
Google API Console	Data access & analytics, e-commerce, etc.	<a href="https://developers.google.com/apis-explorer/#p/">https://developers.google.com/apis-explorer/#p/</a>
New York Times	News	<a href="http://developer.nytimes.com/">http://developer.nytimes.com/</a>



# Interfaces for Web Service APIs

- SOAP
  - *Simple Object Access Protocol*
  - early, widespread web service protocol
  - exposes components of application logic as services
  - XML
- REST
  - *Representational State Transfer*
  - now > 70% of public APIs
  - accesses data
  - variety of data formats, coupled with JSON
  - generally faster and uses less bandwidth
  - easier to integrate with existing websites

## Overview of RESTful API

### Description Languages:

[https://en.wikipedia.org/wiki/Overview\\_of\\_RESTful\\_API\\_Description\\_Languages](https://en.wikipedia.org/wiki/Overview_of_RESTful_API_Description_Languages)

### roll your own:

<https://www.restapitutorial.com/>  
<https://aws.amazon.com/api-gateway>





# HTTP

- HyperText Transfer Protocol
- underlies RESTful APIs
- 4 major methods
  - GET fetches data from web server
  - PUT edits data on web server
  - POST adds new data
  - DELETE removes data

## • HTTP Status Codes

- 1xx informational
- 2xx success
- 3xx redirection
- 4xx client error
- 5xx server error

<https://www.restapitutorial.com/httpstatuscodes.html>



# Elements of an API call

- **endpoint**
  - URL of a server page that provides data or functionality via **requests** and **responses**
- **protocol**
  - the communication standard for passing requests to an endpoint
- **authentication**
  - secure **identification** of user making request
  - if a developer creates an app for other users, the app needs to obtain **authorisation** from the owner of the API for both the developer's access *and* the user's access



# Authentication Protocols

- HTTP Basic Access Authentication
  - username + password
  - transmitted in header of HTTP request
  - weakly encoded, no encryption
- OAuth 1.0
  - uses encrypted tokens
- OAuth 2.0
  - simpler, more robust than OAuth 1.0



# OAuth 2.0

- token-based
  - e.g. *client\_id* & *client\_secret*
  - allows a 3<sup>rd</sup>-party app to access a user's/developer's account **without knowing the account password**
  - allows an end-user to access an API via *your* app, using *their* token
- redirect URL
  - **registered** when app created
  - OAuth 2.0 service **returns user to this URL** after authorising (and issuing a user token)
  - protects access token from **interception**

<https://www.oauth.com/oauth2-servers/background/>



# Developer Access

- some API's have **a developer mode** that may allow access without requesting a user token
- options for connect/request include:
  - use developer's *user\_id* and *password*
  - use *app\_id*, developer's *client\_id*, developer's *secret*
- access granted **may** include
  - read developer's posts, comments, profile, etc.
  - post to developer's account
  - read other users' posts, comments, profiles, etc.



# Python Libraries: Utilities

## requests

- HTTP library (“elegant and simple”)
- <http://www.python-requests.org/en/latest/>
- returns JSON-formatted byte strings

## json

- JSON  $\leftrightarrow$  lists, dictionaries
- <https://docs.python.org/2/library/json.html>

## untangle, xmltodict

- parses XML to Pythonic data structures

## BeautifulSoup (bs4)

- parses HTML, XML to Pythonic data structures



# Python Libraries: API Wrappers

- simplify usage of APIs by introducing a Python API into the loop
- use data types & structures familiar to Python developers

***pyfacebook***

***linkedin***

***praw*** (Reddit)

***bucketstore*** (Amazon S3)

***python-forecastio*** (weather)

***foursquare*** (location-based networking)

***GooPyCharts*** (Google Charts)

***indeed*** (indeed.com)

***kiteconnect*** (stock trading)

***pymaps*** (Google Maps)

***pymed*** (PubMed)

***pyspotify*** (Spotify)

***newsapi***

***rottentomatoes*** (crowd-based movie reviews)

***sportradar*** (sport APIs)

***tesseractocr*** (OCR)

***bowshock*** (NASA)

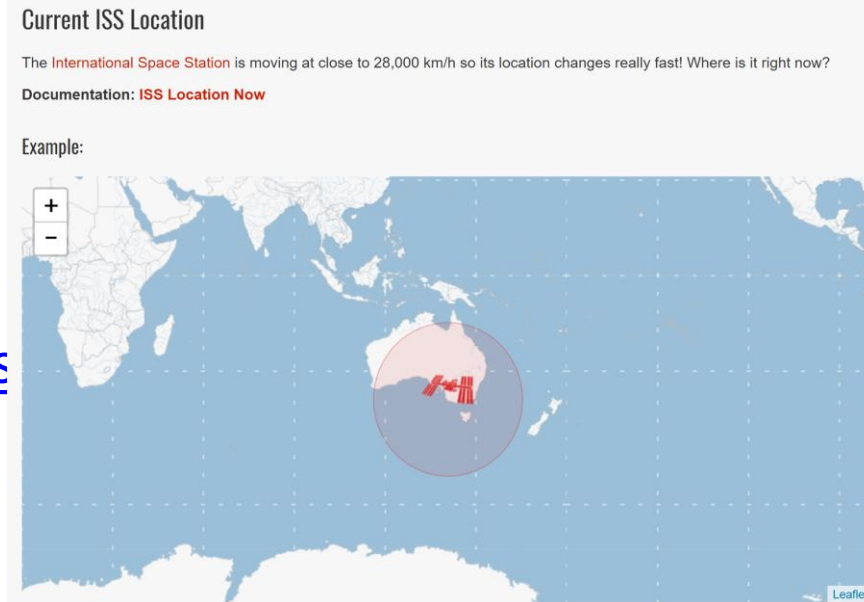
***geopy*** (geocoding)

<https://github.com/realpython/list-of-python-api-wrappers>



# Lab 2.2.1: Querying the ISS

- Purpose:
  - To become familiar with basic API requests and responses
- Resources:
  - API for the International Space Station:  
**OpenNotify**  
<http://open-notify.org/Open-Notify-API/>
  - HTTP response codes  
<https://www.restapitutorial.com/httpstatus>
- Materials:
  - 'Lab 2.2.1.ipynb'







# Extracting Data from APIs

- Twitter API
- Reddit API
- Facebook API
- Google Public Data and BigQuery API



# Twitter API

- Twitter API structure
- API Usage restrictions
- Developer / App approval





- <http://socialmedia-class.org/twittertutorial.html>





# Twitter API

1. If you haven't got one, open a Twitter user account
2. Create a Twitter app (<https://developer.twitter.com/en/apps>)
3. Register the app for API access
4. Store your credentials
  - for accessing your account:
    - user name
    - password
  - for authenticating your app:
    - user agent (information describing your app)
    - client ID (a unique identifier for your app)
    - client secret (secure token for authorising your app to access the API)



# Twitter App Restrictions

- Terms & Conditions:

C. **Geographic Data.** Your license to use Twitter Content in this Agreement does not allow you to (and you will not allow others to) aggregate, cache, or store location data and other geographic information contained in the Twitter Content, except in conjunction with the Twitter Content to which it is attached. Your license only allows you to use such location data and geographic information to identify the location tagged by the Twitter Content. Any use of location data or geographic information on a standalone basis or beyond the license granted herein is a breach of this Agreement.



# Twitter App Approval

## New developer requirements to protect our platform

[https://blog.twitter.com/developer/en\\_us/pics/tools/2018/new-developer-requirements-to-protect-our-platform.html](https://blog.twitter.com/developer/en_us/pics/tools/2018/new-developer-requirements-to-protect-our-platform.html)



### Application under review.

Thanks! We've received your application and are reviewing it. We'll be in touch soon.

We review applications to ensure compliance with our Terms of Service and Developer policies. [Learn more.](#)

To help us understand how you use your existing apps, please [edit each of your apps](#) and add a description of your app's use case where it says "Tell us how this app will be used".

You'll receive an email when the review is complete. While you wait, check out our [documentation](#), explore our [tutorials](#), or check out our [community forums](#).



# Lab 2.2.2: Mining Social Media with Twitter

- Purpose:
  - To develop skills in using a more complex API
- Resources:
  - Python library for Twitter API: *Tweepy*
    - <http://docs.tweepy.org>
- Materials:
  - 'Lab 2.2.2.ipynb'





# Reddit API

- Introduction to Reddit
- API structure
- Developer access
- Reddit API: Using Python



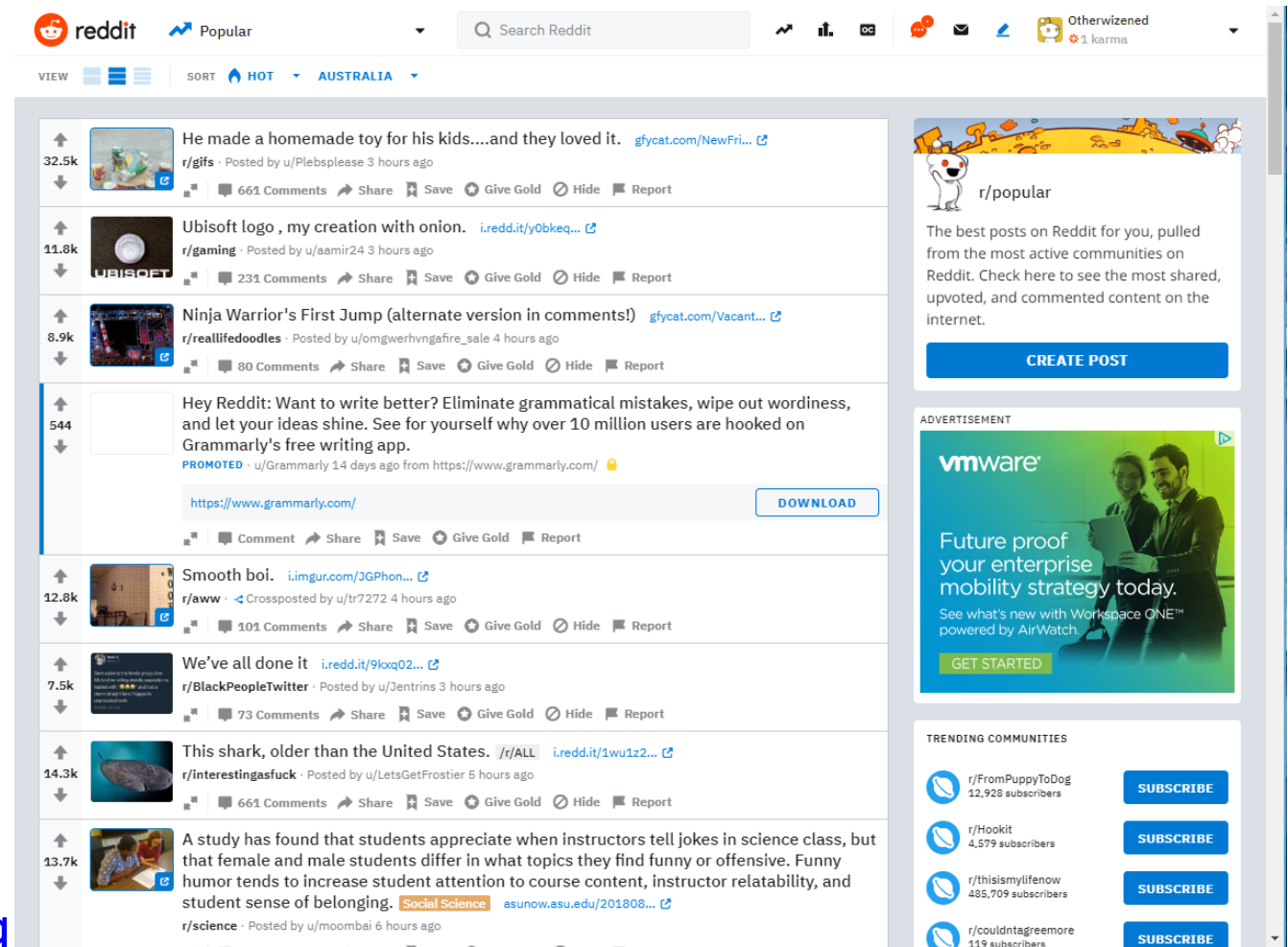




# Reddit

- why Reddit?
  - good example of a social media product
  - rich content
  - large user base
  - highly structured API
  - immediately accessible

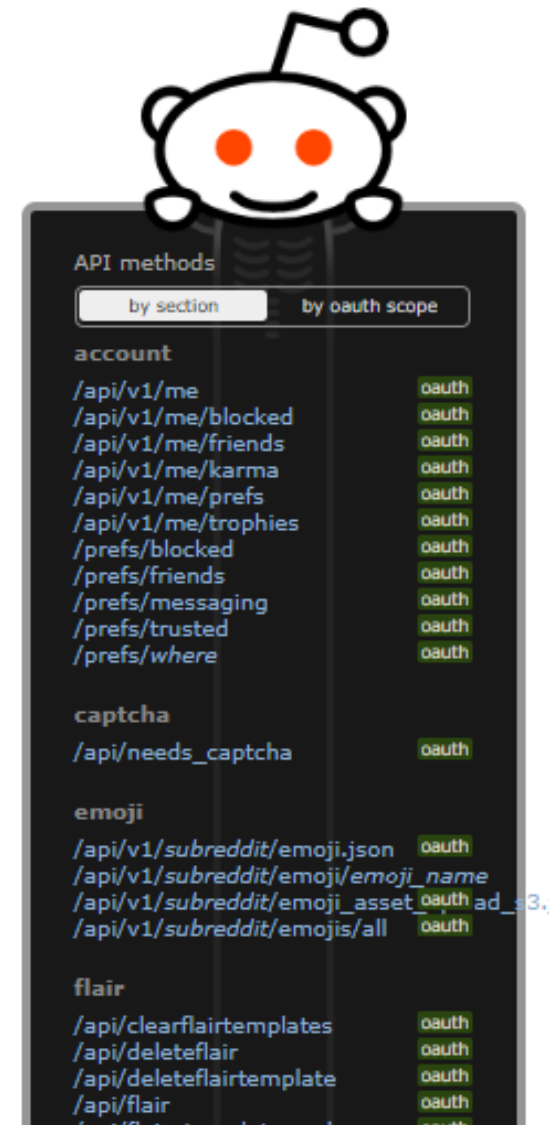
<https://www.reddit.com/wiki/faq>





# Reddit API

- *Account* endpoints:
  - *me, me/friends, me/prefs, ...*
- *Links & comments* endpoint:
  - *comment, vote, report, ...*
- *Listing* endpoints:
  - categories
    - *hot, new, random, ...*
  - navigation (pagination) and filtering
    - *before, after, count, show*
- and many more ...



<https://www.reddit.com/dev/api>



# Reddit API: Developer Access

1. Open a Reddit user account
2. Create a Reddit app
3. Register the app for API access
4. Store your credentials
  - for accessing your account:
    - user name
    - password
  - for authenticating your app:
    - user agent (information describing your app)
    - client ID (a unique identifier for your app)
    - client secret (secure token for authorising your app to access the API)



# Reddit API: Using Python

- install PRAW package
- import praw
- create a connection object (to Reddit API)
- invoke API methods on the connection object
  - send requests that GET or PUT data to/from Reddit objects
- do something with data!

<https://www.reddit.com/r/popular/>

<https://www.reddit.com/wiki/faq>

[https://praw.readthedocs.io/en/stable/getting\\_started/quick\\_start.html](https://praw.readthedocs.io/en/stable/getting_started/quick_start.html)



## Lab 2.2.3: Mining Social Media with Reddit (Optional homework)

- Purpose:
  - To develop skills in using a media-rich API
- Resources:
  - Python library for Reddit API: **PRAW**  
[https://praw.readthedocs.io/en/stable/getting\\_started/quick\\_start.html](https://praw.readthedocs.io/en/stable/getting_started/quick_start.html)
- Materials:
  - 'Lab 2.2.3.ipynb'





# Discussion

- Questions



# HOMEWORK

- Continue working with Lab 2.2.2 / 2.2.3:
  - choose one or more Twitter or Reddit API members and write code to demonstrate how they could be used to reveal something interesting



# Facebook API

- developer tools
- app review process







# Facebook API

## Developer

### Tools



#### **Graph API Explorer**

Test, create, and authenticate API calls and debug responses.



#### **Sharing Debugger**

Preview how your content will look when it's shared to Facebook.



#### **Access Token Debugger**

See detailed info for an access token.

use Graph API Explorer for developing requests to use in API calls from your (Python) application code



# Facebook Graph API Explorer

- discover object model
  - graph structure
  - field names
- test code before moving to Python
- experiment with permissions

Graph API Explorer

Application: [?] Allen's first app ▼

Access Token: EAAa5jhGKG1QBAH4aY4ey9ILPNSxylptK3v5DrrZB7I8uiGqkTSYBcwhEIHT06f7vwjZBFVxybagalrPTcOpqrVJloxA8l1G3ZBINI6Ab6hutNEf ➡ Get Token ▼

GET → /v3.1 /me?fields=posts{comments} ★ Submit

Learn more about the Graph API syntax

Node: me

- ☒ posts
  - ☒ comments
    - + Search for a field
    - + Search for a field
    - + Search for a field

```
{
  "posts": {
    "data": [
      {
        "id": "10215479572290159_10214939181380724"
      },
      {
        "id": "10215479572290159_10214938473403025"
      },
      {
        "id": "10215479572290159_10214846168575462"
      },
      {
        "id": "10215479572290159_10214837229992003"
      },
      {
        "id": "10215479572290159_10214790677388217"
      },
      {
        "id": "10215479572290159_10214789689643524",
        "comments": {
          "data": [
            {
              "created_time": "2018-05-12T06:43:19+0000",
              "from": {
                "name": "Allen Nugent",
                "id": "10215479572290159"
              },
              "message": "Good show, BTW. Very tight band (which is essential for covering Cold Chisel, of course!)",
              "id": "10214789689643524_10214795955360163"
            }
          ]
        },
        "paging": {
          "cursors": {
            "before": "WTISdGjXVnVkrJlqZAFhKemIzSTZANVEF5TVRRM09UVTVOVFV6TmPBeE5qTTZANVFV5TmPFd056TTVPUT09",
            "after": "WTISdGjXVnVkrJlqZAFhKemIzSTZANVEF5TVRRM09UVTVOVFV6TmPBeE5qTTZANVFV5TmPFd056TTVPUT09"
          }
        }
      }
    ]
  },
  "paging": {
    "cursors": {
      "before": "WTISdGjXVnVkrJlqZAFhKemIzSTZANVEF5TVRRM09UVTVOVFV6TmPBeE5qTTZANVFV5TmPFd056TTVPUT09",
      "after": "WTISdGjXVnVkrJlqZAFhKemIzSTZANVEF5TVRRM09UVTVOVFV6TmPBeE5qTTZANVFV5TmPFd056TTVPUT09"
    }
  }
}
```

Response received in 775 ms

Copy Debug Information </> Get Code Save Session



# Facebook App Review

- apps must be submitted to Facebook for review before they can go live
- as of May 2018, permission is required before any endpoint (other than the user's own pages) can be accessed from Graph API Explorer

The screenshot shows the Facebook Graph API Explorer interface. The top bar contains a search input with the text "GET → /v3.1 / GameofThrones?fields=id,name" and a "Submit" button. Below the search bar, on the right, is a link that says "Learn more about the Graph API syntax". The main area is split into two panels. The left panel, titled "Node: GameofThrones", shows a list of fields with checkboxes: "id" and "name" are both checked, and there is a search input labeled "Search for a field". The right panel displays the JSON response, which is an error message: {"error": {"message": "(#10) To use 'Page Public Content Access', your use of this endpoint must be reviewed and approved by Facebook.", "type": "OAuthException", "code": 10, "fbtrace\_id": "EVnHdKVqIc1"}}



# Google Cloud Platform

- public data sets / BigQuery
- APIs based on data science products





# Google Cloud Platform

Google Cloud SDK	<ul style="list-style-type: none"><li>• <a href="https://cloud.google.com/sdk/gcloud/">https://cloud.google.com/sdk/gcloud/</a></li><li>• <a href="https://cloud.google.com/sdk/docs/initializing">https://cloud.google.com/sdk/docs/initializing</a></li></ul>
Google Cloud Platform	<ul style="list-style-type: none"><li>• <a href="https://github.com/GoogleCloudPlatform/python-docs-samples">https://github.com/GoogleCloudPlatform/python-docs-samples</a></li><li>• <a href="https://googlecloudplatform.github.io/google-cloud-python/">https://googlecloudplatform.github.io/google-cloud-python/</a></li><li>• <a href="https://googlecloudplatform.github.io/google-cloud-python/latest/">https://googlecloudplatform.github.io/google-cloud-python/latest/</a></li></ul>
Google API Client Libraries	<ul style="list-style-type: none"><li>• <a href="https://developers.google.com/api-client-library/">https://developers.google.com/api-client-library/</a></li></ul>
Google BigQuery	<ul style="list-style-type: none"><li>• <a href="https://cloud.google.com/bigquery/public-data/">https://cloud.google.com/bigquery/public-data/</a></li><li>• <a href="https://cloud.google.com/bigquery/docs/quickstarts/quickstart-web-ui">https://cloud.google.com/bigquery/docs/quickstarts/quickstart-web-ui</a></li><li>• <a href="https://cloud.google.com/bigquery/docs/reference/libraries">https://cloud.google.com/bigquery/docs/reference/libraries</a></li><li>• <a href="https://cloud.google.com/bigquery/create-simple-app-api">https://cloud.google.com/bigquery/create-simple-app-api</a></li><li>• <a href="https://github.com/GoogleCloudPlatform/google-cloud-python/tree/master/bigquery">https://github.com/GoogleCloudPlatform/google-cloud-python/tree/master/bigquery</a></li></ul>



# Google Public Data sets

- accessible via Google BigQuery
- free for 1<sup>st</sup> TB / month
- subject areas:
  - genomics
  - medicine & epidemiology
  - geo imagery (Earth science, weather, etc.)
  - transport & service utilisation
  - annotated images
  - etc.
- <https://cloud.google.com/public-datasets/>



# Google BigQuery

Quickstart to  
BigQuery Web UI:

[https://cloud.google.com/  
bigquery/docs/quickstarts  
/quickstart-web-ui](https://cloud.google.com/bigquery/docs/quickstarts/quickstart-web-ui)

The screenshot displays the Google Cloud Platform BigQuery interface. The top navigation bar includes the Google Cloud Platform logo, the project name 'MyReallyBigQuery', and a search bar. The main interface is divided into a left sidebar and a main content area. The sidebar contains links to 'Query history', 'Saved queries', 'Job history', 'Transfers', and 'Resources'. The main content area is titled 'Query editor' and contains a SQL query: 

```
1 SELECT
2   name, gender,
3   SUM(number) AS total
4 FROM
5   `bigquery-public-data.usa_names.usa_1910_2013`
6 GROUP BY
7   name, gender
8 ORDER BY
9   total DESC
10 LIMIT
11  100
```

 Below the query editor, there are buttons for 'Run query', 'Save query', 'Save view', and 'Options'. A status message indicates 'This query will process 99.95 MB when run.' The 'Query results' section shows a table with columns 'name', 'gender', and 'total'. The table contains three rows of data: James (M, 4924235), John (M, 4818746), and Robert (M, 4703680). The bottom of the interface shows pagination controls for 'Rows per page' and '1 - 50 of 100'.

Query editor

```
1 SELECT
2   name, gender,
3   SUM(number) AS total
4 FROM
5   `bigquery-public-data.usa_names.usa_1910_2013`
6 GROUP BY
7   name, gender
8 ORDER BY
9   total DESC
10 LIMIT
11  100
```

Processing location: US

Run query Save query Save view Options

This query will process 99.95 MB when run.

Query results

Query complete (1.391 sec elapsed, 99.95 MB processed)

Job information Results JSON Execution details

Row	name	gender	total
1	James	M	4924235
2	John	M	4818746
3	Robert	M	4703680

Rows per page: 50 1 - 50 of 100



# BigQuery API: Authentication

## Service accounts

- for client apps that you will run
  - e.g. dev/test, batch processing pipelines
- authentication via your service credentials

## User accounts

- for apps you create for other end-users
  - e.g. data products
- authentication via end-users credentials
  - app can only access BigQuery tables that the end-user is authorised to access
  - end-user gets billed for queries

<https://cloud.google.com/bigquery/docs/authentication/>





# BigQuery API: Authentication – cont'd

[GCP CONSOLE](#) [COMMAND LINE](#)

1. Go to the **Create service account key** page in the GCP Console.

GO TO THE CREATE SERVICE ACCOUNT KEY PAGE
2. From the **Service account** drop-down list, select **New service account**.
3. Enter a name into the **Service account name** field.
4. From the **Role** drop-down list, select **Project > Owner**.

★ **Note:** The **Role** field authorizes your service account to access resources. You can view and change this field later using [GCP Console](#). If you are developing a production application, specify more granular permissions than **Project > Owner**. For more information, see [granting roles to service accounts](#).

5. Click **Create**. A JSON file that contains your key downloads to your computer.

Google Cloud Platform MyReallyBigQuery

Create service account key

Service account

New service account

Service account name ?

bigquery-api-service

Role ?

BigQuery Admin

Service account ID

bigquery-api-service @myreallybigquery.iam.gserviceaccount.co

Key type

Downloads a file that contains the private key. Store the file securely because this key cannot be recovered if lost.

☒ JSON

Recommended

☐ P12

For backward compatibility with code using the P12 format

Create

Cancel

<https://cloud.google.com/docs/authentication/production>



# BigQuery API: Authentication – cont’d

Google Cloud Platform

MyReallyBigQuery

API

Credentials

Credentials

OAuth consent screen

Domain verification

Create credentials

Delete

Create credentials to access your enabled APIs. [Refer to the API documentation](#) for details.

Service account keys

ID	Creation date	Service account
75516912d806a1ecdc78fa935cadb396cf9d11c6	21 Aug 2018	bigquery-api-service



# Using the Google Authentication Key

**Option 1:** Set GOOGLE\_APPLICATION\_CREDENTIALS environment variable

- Linux / MacOS

```
$ export GOOGLE_APPLICATION_CREDENTIALS="[PATH]"
```

- Windows

```
$ set GOOGLE_APPLICATION_CREDENTIALS="[PATH]"
```

**Option 2:** Pass the path to the service account key in code

```
from google.cloud import storage
```

```
storage_client = storage.Client.from_service_account_json('[PATH]')
```

*where '[PATH]' is the full file path of the json key file*



# Google BigQuery API: Top-Level Object

client object:

- **connection**
  - authenticated connection to the BigQuery service
  - determines credentials
    - implicitly from the environment,
    - or directly via *from\_service\_account\_json* and *from\_service\_account\_p12*
- **project**
  - top-level container
  - tied to billing
  - can provide default access control across all its datasets
  - access control list (ACL)
    - grants reader / writer / owner permission to one or more entities
    - must be managed using the Google Developer Console (not API)



# BigQuery API Object Hierarchy

bigquery

- .projects

- .datasets

  - .get, .delete, .insert, .list, .update, ...

- .tabledata

- .tables

- .jobs

  - .get, .cancel, .insert, .list, .query, ...

...

<https://developers.google.com/apis-explorer/#p/bigquery/v2/>



# Lab 2.2.4: Big Data Analytics with BigQuery

- Purpose:

- (1) To learn how to the Google BigQuery Web UI for discovering public data sets and performing basic analytics.
- (2) To become proficient with the Google BigQuery API for wrangling Google's public datasets.

- Materials:

- 'Lab 2.2.4.ipynb'





## Lab 2.2.4 – cont'd

- Python packages :
  - pyarrow (pip)
  - google-cloud-bigquery (conda-forge)
  - google-cloud-storage (conda-forge)
- Resources:
  - Google BigQuery Public Datasets <https://cloud.google.com/bigquery/public-data/>
  - BigQuery UI <https://cloud.google.com/bigquery/docs/quickstarts/quickstart-web-ui>
  - Python client for BigQuery API <https://github.com/GoogleCloudPlatform/google-cloud-python/tree/master/bigquery>



# Discussion

- Extracting data using APIs
  - applications?





# Lab/ HOMEWORK

1. Create a mini-project based on any skills from the course so far:
  - select an interesting public data set or form a question you are interested answer and identify data needed to answer the question
  - use Jupyter Notebook to access, analyse and visualise the data
2. Prepare a 5-minute presentation
  - use Jupyter Notebook
  - organise as:
    - question
    - dataset & analysis
    - conclusion
3. plan to present to the class



# Presentations

- each team
  - 5 minute presentation



# Analytics-Based APIs

- **Google**

- Google Analytics
  - <https://developers.google.com/analytics/>
- Google Cloud Vision
  - <https://cloud.google.com/vision/>
- Google Cloud AI
  - <https://cloud.google.com/products/ai/>

- **IBM Watson**

- Developer Cloud
  - <https://www.ibm.com/watson/developercloud/>
  - <https://github.com/watson-developer-cloud/python-sdk>
- Mashups
  - <https://www-01.ibm.com/common/ssi/cgi-bin/ssialias?subtype=SP&infotype=PM&htmlfid=LBS03048USEN&attachmen t=LBS03048USEN.PDF>



# Analytics-Based APIs – cont'd

- AWS
  - Boto3
    - low-level (“client”) and high-level (“resource”) APIs for all AWS products
    - <https://aws.amazon.com/sdk-for-python/>
  - API Explorer
    - <https://developers.google.com/apis-explorer/#search/analytics/analytics/v3/>
- Azure
  - Code samples, Cognitive Services API, etc.
    - <https://docs.microsoft.com/en-us/python/azure/?view=azure-python>
  - Python API Browser
    - <https://docs.microsoft.com/en-au/python/api/?view=azure-python>



# Machine Vision APIs

- use cases:
  - autonomous vehicles
  - industrial control & QA
  - face recognition
  - number plate recognition
  - biometric identity verification
  - print & handwriting transcription
  - image annotation
    - detecting and labelling objects or themes in an image



# Creating APIs

- Why would a data scientist/engineer want to create their own API?
  - for building an interface to your data product
  - for enforcing control over how your application's data and services can be used
  - for isolating the IP that your data product is based on
- References:
  - <https://www.fullstackpython.com/application-programming-interfaces.html>



# Discussion

## More Open Data APIs

- List of Open APIs (Wikipedia)  
[https://en.wikipedia.org/wiki/List\\_of\\_open\\_APIs](https://en.wikipedia.org/wiki/List_of_open_APIs)
- List of Open Data APIs (Programmable Web)  
<https://www.programmableweb.com/category/open-data/api>
- todmotto Public APIs  
<https://github.com/toddmotto/public-apis>



# HOMEWORK

1. Investigate a data or analytic API for one of the following:
  - AWS
  - Microsoft Azure
  - IBM Cloud
2. Create a Jupyter notebook that demonstrates some basic operations (e.g. transporting, querying, or visualising data).

## NOTES:

- The offerings of these platforms are myriad and complex. It may not be obvious which API you need to use at first, so try to start with published code examples.
- APIs (and the libraries that wrap them) change. Online examples may not work as documented.





# Questions?



# End of Presentation!