

### Nested Data



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## Dicts of Lists of Dicts of Lists of...

### Not all data is *tabular...*

- sometimes we have to wrangle messy data into a DataFrame-y shape
  - API Responses & Data sent over the web
  - Survey responses
  - Data collected by hand
- other times we deal with data structures that aren't cleanly reducible to tables no matter what
  - family trees
  - certain file formats, like SVGs

## **Example: Historical Weather API**

open-meteo.com maintains a service that lets you look up historical weather records for free using programs or a web form.

Unfortunately, when you ask it for some weather data, it looks like this:

{"latitude":47.90861,"longitude":-110.44777,"gener ationtime ms":21.31497859954834,"utc offset second s":0,"timezone":"GMT","timezone\_abbreviation":"GMT ","elevation":786.0,"hourly\_units":{"time":"iso860 1","temperature\_2m":"°F","precipitation":"inch"}," hourly":{"time":["1972-01-15T00:00","1972-01-15T01 :00", "1972-01-15T02:00", "1972-01-15T03:00", "1972-0 1-15T04:00", "1972-01-15T05:00", "1972-01-15T06:00", "1972-01-15T07:00", "1972-01-15T08:00", "1972-01-15T 09:00", "1972-01-15T10:00", "1972-01-15T11:00", "1972 -01-15T12:00", "1972-01-15T13:00", "1972-01-15T14:00 ","1972-01-15T15:00","1972-01-15T16:00","1972-01-1 5T17:00", "1972-01-15T18:00", "1972-01-15T19:00", "19 72-01-15T20:00", "1972-01-15T21:00", "1972-01-15T22: 00","1972-01-15T23:00"],"temperature\_2m":[-3.3,-1. 1,2.4,7.4,11.5,14.4,17.4,20.2,23.2,25.6,29.1,31.0, 32.5,33.1,33.1,33.4,34.2,34.8,35.8,37.3,38.4,39.3, 39.5,39.6], "precipitation": [0.000,0.000,0.000,0.00 0, 0.000.000, 0.000,000, 0.000, 0.000, 0.000

## Formatting to the Rescue



This is an example of **JSON** data

(Javascript Object Notation)

### JSON is a common standard for data returned from requests made on the internet.

- Not just for Javascript
- In fact, it looks a lot like a Python dictionary...

```
Ł
    "latitude": 47.90861,
    "longitude": -110.44777,
    "generationtime_ms": 21.31497859954834,
    "utc_offset_seconds": 0,
    "timezone": "GMT",
    "timezone_abbreviation": "GMT",
    "elevation": 786,
    "hourly_units": {
        "time": "iso8601",
        "temperature_2m": "°F",
        "precipitation": "inch"
  },
"hourly": {
    "time";
        "time": ["1972-01-15T00:00", "1972-01-15T01:00", ...],
        "temperature_2m": [-3.3, -1.1, ...],
        "precipitation": [0, 0, ...]
    }
```

## JSON



### JSON & Python



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### Python has a built-in JSON encoding and decoding library called json. json.loads() ("load string") parses a string of JSON data into a dictionary.

```
import json
data_string = '{"name" : "Harry"}'
data_dict = json.loads(data_string)
print(data_dict)
print(data_dict["name"])
```



```
{'name': 'Harry'}
Harry
```

# JSON

### json.load() parses a string of JSON data into a dictionary.

```
import json
data_file = open('weather_response.json', 'r')
data_dict = json.load(data_file)
print(data_dict.keys())
```

dict\_keys(['latitude', 'longitude', 'generationtime\_ms', 'utc\_offset\_seconds', 'timezone', 'timezone\_abbreviation', 'elevation', 'hourly\_units', 'hourly'])

# **JSON**

## **Traversing Through JSON Data**

### Here are our keys...

dict\_keys(['latitude', 'longitude', 'generationtime\_ms', 'utc\_offset\_seconds', 'timezone', 'timezone\_abbreviation', 'elevation', 'hourly\_units', 'hourly'])

But how do we read it? And where are time and temperature in the dictionary?

```
"latitude": 47.90861,
"longitude": -110.44777,
"generationtime_ms": 21.31497859954834,
"utc_offset_seconds": 0,
"timezone": "GMT",
"timezone_abbreviation": "GMT",
"elevation": 786,
"hourly_units": {
    "time": "iso8601",
    "temperature_2m": "°F",
    "precipitation": "inch"
},
"hourly": {
    "time": ["1972-01-15T00:00", "1972-01-15T01:00", ...],
    "temperature_2m": [-3.3, -1.1, ...],
    "precipitation": [0, 0, ...]
```

### A JSON Object will often have a nested, hierarchical structure.

Some keys in the dictionary map to primitives

```
"latitude": 47.90861,
"longitude": -110.44777,
"generationtime_ms": 21.31497859954834,
"utc_offset_seconds": 0,
```

• Other keys map to other dictionaries...

```
"hourly_units": {
    "time": "iso8601",
    "temperature_2m": "°F",
    "precipitation": "inch"
},
```

## **Nesting in JSON Data**

### A JSON Object will often have a nested, hierarchical structure.

And sometimes those dictionaries store other dictionaries or lists themselves!

```
"hourly": {
    "time": ["1972-01-15T00:00", "1972-01-15T01:00", ...],
    "temperature_2m": [-3.3, -1.1, ...],
    "precipitation": [0, 0, ...]
3
```

# **Nesting in JSON Data**

# **Working with Nested Structures**

Answering questions using nested structures/JSON often requires...

- careful study of the structure by looking at keys, brackets
- list indexing and dictionary lookups, which you already know how to do!

### Where is this weather sample taken from?

Ł

```
"latitude": 47.90861,
"longitude": -110.44777,
"generationtime_ms": 21.31497859954834,
"utc_offset_seconds": 0,
"timezone": "GMT",
"timezone_abbreviation": "GMT",
"elevation": 786,
"hourly_units": {
    "time": "iso8601",
    "temperature_2m": "°F",
    "precipitation": "inch"
},
"hourly": {
    "time": ["1972-01-15T00:00", "1972-01-15T01:00", ...],
    "temperature_2m": [-3.3, -1.1, ...],
    "precipitation": [0, 0, ...]
}
```

### Where is this weather sample taken from?



Sample is from coordinates (39.964848, 75.2933) at elevation of 2924.0 feet.

Ł

```
"latitude": 47.90861,
"longitude": -110.44777,
"generationtime_ms": 21.31497859954834,
"utc_offset_seconds": 0,
"timezone": "GMT",
"timezone_abbreviation": "GMT",
"elevation": 786,
"hourly_units": {
    "time": "iso8601",
    "temperature_2m": "°F",
    "precipitation": "inch"
},
"hourly": {
    "time": ["1972-01-15T00:00", "1972-01-15T01:00", ...],
    "temperature_2m": [-3.3, -1.1, ...],
    "precipitation": [0, 0, ...]
}
```

data = json.load(weather\_file) units = data["temperature\_2m"]

```
data = json.load(weather_file)
units = data["hourly_units"]
degrees = units["temperature_2m"]
print(f"Temperature given in {degrees}.")
```



Temperature given in °F.

## **Answering Questions**

15

data = json.load(weather\_file) degrees = data["hourly\_units"]["temperature\_2m"] print(f"Temperature given in {degrees}.")

Temperature given in °F.

### How many temperature samples are included? What was the range of temperatures measured?

```
Ł
    "latitude": 47.90861,
    "longitude": -110.44777,
    "generationtime_ms": 21.31497859954834,
    "utc_offset_seconds": 0,
    "timezone": "GMT",
    "timezone_abbreviation": "GMT",
    "elevation": 786,
    "hourly_units": {
        "time": "iso8601",
        "temperature_2m": "°F",
        "precipitation": "inch"
  },
"hourly": {
    "time";
}
        "time": ["1972-01-15T00:00", "1972-01-15T01:00", ...],
        "temperature_2m": [-3.3, -1.1, ...],
        "precipitation": [0, 0, ...]
```

### How many temperature samples are included?

What was the range of temperatures measured?

data = json.load(weather\_file) degrees = data["hourly\_units"]["temperature\_2m"] temperatures = data["hourly"]["temperature\_2m"] num\_samples = len(temperatures) low, high = min(temperatures), max(temperatures) temp\_range = high - low print(f"Over {num\_samples} samples,") print(f"the temperature shifted from {high} to {low}.") print(f"That's a swing of {temp\_range} {degrees}!")

Over 360 samples, the temperature shifted from 59.0 to 31.2. That's a swing of 27.8 °F!



### **Trees & XML**



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Trees in a hierarchie elements have con

## **Tree Data**

- **Trees** in computer science are hierarchical collections of data
- elements (often called nodes) that
- have connections between them.
- e.g. family trees

## XML

### **XML** is a data document format that allows us to represent data nested inside of other data.

```
<inventory>
        <drink>
                <lemonade>
                         <price>$2.50</price>
                         <amount>20</amount>
                </lemonade>
                <pop brand="Pepsi">
                         <price>$1.50</price>
                         <amount>10</amount>
                </pop>
        </drink>
        <snack>
                <chips flavor="BBQ">
                         <price>$4.50</price>
                         <amount>60</amount>
                </chips>
        </snack>
</inventory>
```

http://www.tizag.com/xmlTutorial/xmltree.php



price

- **Elements** are the entities being represented in the XML tree, e.g. an inventory or a price.
- **Tags** are the names that we give to the elements, e.g. <inventory> or <price>
- Attributes are properties that individual elements can have, stored in the tags • If the pop element is specifically a Pepsi, we could have its tag be <pop brand="Pepsi">.

<inventory> <drink>

</drink>

<snack>

</snack> </inventory>

# Some XML Terminology

```
<lemonade>
        <price>$2.50</price>
        <amount>20</amount>
</lemonade>
<pop brand="Pepsi">
        <price>$1.50</price>
        <amount>10</amount>
</pop>
<chips flavor="BBQ">
        <price>$4.50</price>
        <amount>60</amount>
</chips>
```

- The **tree** is the collection of elements being represented and the connections between them
- The **root** is the element of the tree that has no ancestors.
- An **ancestor** is an element that contains another element.
  - A **parent** is a direct ancestor.
- A **descendant** is an element that is contained by another element. • A **child** is a direct descendant.

<inventory> <drink>

</drink>

<snack>

</snack> </inventory>

## Some Tree Terminology

```
<lemonade>
        <price>$2.50</price>
        <amount>20</amount>
</lemonade>
<pop brand="Pepsi">
        <price>$1.50</price>
        <amount>10</amount>
</pop>
<chips flavor="BBQ">
        <price>$4.50</price>
        <amount>60</amount>
</chips>
```

### It's a convenient standard for representing hierarchy.

- Family trees, inventory systems
- Degree requirements & course dependencies

Many visual elements are best represented as hierarchical data

- PowerPoints and Word Documents are actually just XML documents rendered in a fancy way Slides, which have boxes, which have images & text, which each have properties...
- Some image formats are XML, like SVG

## Why XML?

```
<ns0:svg xmlns:ns0="http://www.w3.org/2000/svg" id="emoji" viewBox="0 0 72 72">
  <ns0:g id="color">
    <ns0:path fill="#d0cfce" d="m56..." />
    <ns0:path fill="#9b9b9a" d="m36.."/>
 </ns0:g>
  <ns0:g id="line">
    <ns0:path fill="none" stroke="#000" stroke-linecap="round" ... />
    <ns0:path fill="none" stroke="#000" stroke-miterlimit="10" ... />
 </ns0:g>
</ns0:svg>
```





### XML & Python



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## Parsing XML with Python

BeautifulSoup is a library we can use to parse or modify XML. Need to install it!

pip install bs4

**from** bs4 **import** BeautifulSoup data\_file = open('country\_data.xml', 'r') tree = BeautifulSoup(data\_file, 'xml') data\_file.close()

tree now stores the full XML structure!

### This is country\_data.xml:

### <data>

```
<country name="Liechtenstein">
        <rank>1</rank>
       <year>2008</year>
        <gdppc>141100</gdppc>
        <neighbor name="Austria" direction="E"/>
        <neighbor name="Switzerland" direction="W"/>
   </country>
    <country name="Singapore">
        <rank>4</rank>
        <year>2011</year>
        <gdppc>59900</gdppc>
        <neighbor name="Malaysia" direction="N"/>
   </country>
    <country name="Panama">
        <rank>68</rank>
        <year>2011</year>
        <gdppc>13600</gdppc>
        <neighbor name="Costa Rica" direction="W"/>
        <neighbor name="Colombia" direction="E"/>
   </country>
</data>
```

### https://docs.python.org/3/library/xml.etree.elementtree.html

## **Demo XML**

## Parsing XML with Python

The tree is "rooted" at a data tag, so we could access that tag with:

root = tree.data

**root** stores its tag name and a dictionary of its attributes:

>>> root.name 'data' >>> root.attrs -{ }

"The root is a 'data' element that stores no attributes."

## Look at the Children

### You can iterate over all of the children of an element using .find all(recursive=False)

for child in root.find\_all(recursive=False): print(child.name, child.attrs)

country {'name': 'Liechtenstein'} country {'name': 'Singapore'} country {'name': 'Panama'}

<data> <rank>1</rank> <year>2008</year> </country> <rank>4</rank> <year>2011</year> </country> <country name="Panama"> <rank>68</rank> <year>2011</year> </country> </data>

```
<country name="Liechtenstein">
   <gdppc>141100</gdppc>
   <neighbor name="Austria" direction="E"/>
   <neighbor name="Switzerland" direction="W"/>
<country name="Singapore">
    <gdppc>59900</gdppc>
   <neighbor name="Malaysia" direction="N"/>
    <gdppc>13600</gdppc>
   <neighbor name="Costa Rica" direction="W"/>
   <neighbor name="Colombia" direction="E"/>
```

## You can search over all descendants of an element that

have a specific tag using .find\_all(tag\_name)

for neighbor in root.find\_all('neighbor'): print(neighbor.attrs)

```
{'name': 'Austria', 'direction': 'E'}
{'name': 'Switzerland', 'direction': 'W'}
{'name': 'Malaysia', 'direction': 'N'}
{'name': 'Costa Rica', 'direction': 'W'}
{'name': 'Colombia', 'direction': 'E'}
```

<data> <rank>1</rank> <year>2008</year> </country> <rank>4</rank> <year>2011</year> </country> <country name="Panama"> <rank>68</rank> <year>2011</year> </country> </data>

## Looking Further

```
<country name="Liechtenstein">
   <gdppc>141100</gdppc>
   <neighbor name="Austria" direction="E"/>
   <neighbor name="Switzerland" direction="W"/>
<country name="Singapore">
   <gdppc>59900</gdppc>
   <neighbor name="Malaysia" direction="N"/>
   <gdppc>13600</gdppc>
   <neighbor name="Costa Rica" direction="W"/>
   <neighbor name="Colombia" direction="E"/>
```

.find all(tag name) gives all children of a given element that have a matching tag. .find(tag\_name) or just .tag\_name gives the first child of a given element that have a matching tag.

for country in root.find\_all('country'): rank = country.find('neighbor') print(rank)

<data> <country name="Liechtenstein"> <rank>1</rank> <year>2008</year> </country> <country name="Singapore"> <rank>4</rank> <year>2011</year> </country> <country name="Panama"> <rank>68</rank> <year>2011</year> </country> </data>

<neighbor direction="E" name="Austria"/> <neighbor direction="N" name="Malaysia"/> <neighbor direction="W" name="Costa Rica"/>

# Filtering Children

```
<gdppc>141100</gdppc>
<neighbor name="Austria" direction="E"/>
<neighbor name="Switzerland" direction="W"/>
<gdppc>59900</gdppc>
<neighbor name="Malaysia" direction="N"/>
<gdppc>13600</gdppc>
<neighbor name="Costa Rica" direction="W"/>
<neighbor name="Colombia" direction="E"/>
```