# Análise Clima-Tempo

Semana 12 | Web Scraping, Regex e Pandas

# Objetivo do miniprojeto

A partir de sua escolha de uma cidade qualquer, faça a raspagem de uma página e descubra a temperatura média da próxima semana nesta cidade. Utilize o serviço Tempo na sua solução. (Desejável incluir gráficos do Plotly).

# Projeto-piloto

Aqui, importamos as bibliotecas que utilizaremos para fazer a raspagem e análise de dados.

```
import requests
from bs4 import BeautifulSoup
import pandas as pd
import numpy as np
import plotly.express as px
```

## Seleção do serviço de clima-tempo

Apenas para a ilustração dos passos, vamos fazer a raspagem do National Weather Service, um serviço de climatologia norte-americano. A cidade indicada na url pela latitude e longitude aponta para a cidade de *Ciudad Juarez* (MX), na fronteira dos EUA.

Para que estes passos sejam aplicáveis, é importante verificar se o serviço de clima-tempo apresenta as informações utilizando HTML ou Javascript. Estes passos só servem para respostas em HTML.

```
In [5]: # Localizamos uma cidade usando o próprio serviço de clima-tempo
url = "https://forecast.weather.gov/MapClick.php?lat=31.604&lon=-106.2511#.Xo
```

Download da página. Uma resposta 200 indica que o retorno da página foi bem-sucedido.

```
In [6]: # usamos a biblioteca requests para fazer o download da página web
page = requests.get( url )
page
```

Out[6]: <Response [200]>

A biblioteca BeautifulSoup permite que manipulemos o HTML da página.

```
In [10]: # criamos um objeto beautiful soup para poder fazer a raspagem dos dados
soup = BeautifulSoup(page.content, 'html.parser')
#soup
#print(soup.prettify())
```

Utilizando o modo de inspeção do navegador (ex: Chrome, Firefox, Safari...), identifique o elemento HTML em que deseja extrair as informações.

```
In [12]: # após investigar, com um navegador web, a estrutura da página e localizar o
seven_day = soup.find(id="seven-day-forecast")
seven_day
```

```
Out[12]: <div class="panel panel-default" id="seven-day-forecast">
```

```
<div class="panel-heading">
<br/>b>Extended Forecast for</b>
<h2 class="panel-title">
                2 Miles NW Clint TX </h2>
</div>
<div class="panel-body" id="seven-day-forecast-body">
<div id="seven-day-forecast-container">
-forecast-list">
<div class="tombstone-container">
Today<br/><br/>
<img alt="Today: Sunny, with a high near 95. Calm wind becoming west southw
est 5 to 9 mph in the morning. " class="forecast-icon" src="newimages/medium/f
ew.png" title="Today: Sunny, with a high near 95. Calm wind becoming west sout
hwest 5 to 9 mph in the morning. "/>Sunny<p clas
s="temp temp-high">High: 95 °F</div>
<div class="tombstone-container">
Tonight<br/><br/>
<img alt="Tonight: Mostly clear, with a low around 62. West wind 5 to 10 mp</p>
h becoming light and variable after midnight. " class="forecast-icon" src="ne
wimages/medium/nfew.png" title="Tonight: Mostly clear, with a low around 62. W
est wind 5 to 10 mph becoming light and variable after midnight. "/><p cl
ass="short-desc">Mostly ClearLow: 62 °F</div>
class="forecast-tombstone">
<div class="tombstone-container">
Wednesday<br/><br/>
<img alt="Wednesday: Mostly sunny, with a high near 96. South wind 5 to 15</p>
mph becoming west southwest in the afternoon. " class="forecast-icon" src="new
images/medium/sct.png" title="Wednesday: Mostly sunny, with a high near 96. So
uth wind 5 to 15 mph becoming west southwest in the afternoon. "/><p class
="short-desc">Mostly SunnyHigh: 96 °F</div>
<div class="tombstone-container">
Wednesday<br/>Night
<img alt="Wednesday Night: Partly cloudy, with a low around 64. West southw
est wind 5 to 15 mph. " class="forecast-icon" src="newimages/medium/nsct.png"
title="Wednesday Night: Partly cloudy, with a low around 64. West southwest wi
nd 5 to 15 mph. "/>Partly Cloudy<p class="temp t
emp-low">Low: 64 °F</div>
<div class="tombstone-container">
Thursday<br/><br/>
<img alt="Thursday: Mostly sunny, with a high near 96. Light south southwes
t wind becoming west 11 to 16 mph in the morning. " class="forecast-icon" src
="newimages/medium/sct.png" title="Thursday: Mostly sunny, with a high near 9
6. Light south southwest wind becoming west 11 to 16 mph in the morning. "/></
p>Mostly SunnyHigh: 96 °F
</div>
<div class="tombstone-container">
Thursday<br/>Night
<img alt="Thursday Night: Mostly clear, with a low around 64. West wind 11</p>
to 16 mph decreasing to 5 to 10 mph after midnight. " class="forecast-icon" sr
c="newimages/medium/nfew.png" title="Thursday Night: Mostly clear, with a low
around 64. West wind 11 to 16 mph decreasing to 5 to 10 mph after midnight. "/
>Mostly ClearLow: 64 °F
</div>
<div class="tombstone-container">
Friday<br/><br/>
<img alt="Friday: Sunny, with a high near 97. West wind 5 to 14 mph. " clas
s="forecast-icon" src="newimages/medium/few.png" title="Friday: Sunny, with a
high near 97. West wind 5 to 14 mph. "/>Sunny<p
class="temp temp-high">High: 97 °F</div>
<div class="tombstone-container">
Friday<br/>Night
<img alt="Friday Night: Clear, with a low around 64. West wind 7 to 14 mph</p>
becoming south southwest after midnight. " class="forecast-icon" src="newimage
s/medium/nskc.png" title="Friday Night: Clear, with a low around 64. West wind
7 to 14 mph becoming south southwest after midnight. "/>class="short-de"
sc">ClearLow: 64 °F</div><li class="fore
cast-tombstone">
```

```
<div class="tombstone-container">
         Saturday<br/><br/>
         <img alt="Saturday: Sunny, with a high near 100. South wind 7 to 13 mph bec oming west in the afternoon." class="forecast-icon" src="newimages/medium/fe" src="newimages/medium/fe".
         w.png" title="Saturday: Sunny, with a high near 100. South wind 7 to 13 mph be
         coming west in the afternoon. "/>Sunny<p class
         ="temp temp-high">High: 100 °F</div></div>
         <script type="text/javascript">
         // equalize forecast heights
         $(function () {
                var maxh = 0;
                $(".forecast-tombstone .short-desc").each(function () {
                        var h = $(this).height();
                        if (h > maxh) \{ maxh = h; \}
                });
                $(".forecast-tombstone .short-desc").height(maxh);
         });
         </script> </div>
         </div>
        Dentro do elemento HTML seven-day-forecast, pegamos todos os elementos da classe
         tombstone-container.
In [19]: forecast items = seven day.find all(class = "tombstone-container")
         #forecast items
        O primeiro elemento da lista forecast items representa a manhã de hoje.
In [20]:
         morning = forecast items[0]
         morning
Out[20]: <div class="tombstone-container">
         Today<br/><br/>
         <img alt="Today: Sunny, with a high near 95. Calm wind becoming west southw
         est 5 to 9 mph in the morning. " class="forecast-icon" src="newimages/medium/f
         ew.png" title="Today: Sunny, with a high near 95. Calm wind becoming west sout
         hwest 5 to 9 mph in the morning. "/>Sunny<p clas
         s="temp temp-high">High: 95 °F</div>
In [21]: | # Impressão na tela formatado
         print(morning.prettify())
         <div class="tombstone-container">
          Today
          <br/>
          <br/>
          <img alt="Today: Sunny, with a high near 95. Calm wind becoming west southwe</pre>
         st 5 to 9 mph in the morning. " class="forecast-icon" src="newimages/medium/fe
         w.png" title="Today: Sunny, with a high near 95. Calm wind becoming west south
         west 5 to 9 mph in the morning. "/>
          Sunny
          High: 95 °F
          </div>
        O segundo elemento da lista forecast items representa o próximo período.
In [22]: | afternoon = forecast_items[1]
         print(afternoon.prettify())
         <div class="tombstone-container">
```

```
Tonight
 <br/>
 <br/>
>
 <img alt="Tonight: Mostly clear, with a low around 62. West wind 5 to 10 mph</pre>
becoming light and variable after midnight. " class="forecast-icon" src="newi
mages/medium/nfew.png" title="Tonight: Mostly clear, with a low around 62. Wes
t wind 5 to 10 mph becoming light and variable after midnight. "/>
Mostly Clear
<q\>
Low: 62 °F
</div>
```

# Extraindo informações da página

img = morning.find("img")

In [34]:

imq

A etiqueta representada pela variável morning contém toda a informação de que precisamos:

- O nome do item da previsão neste caso, Morning
- A descrição das condições está localizado no título da propriedade de img
- Uma descrição breve das condições neste caso Patchy Blowing Dust then Cloudy
- A temperatura mínima neste caso 81 °F

```
In [30]:
         morning
Out[30]: <div class="tombstone-container">
         Today<br/><br/>
         <img alt="Today: Sunny, with a high near 95. Calm wind becoming west southw
        est 5 to 9 mph in the morning. " class="forecast-icon" src="newimages/medium/f
        ew.png" title="Today: Sunny, with a high near 95. Calm wind becoming west sout
        hwest 5 to 9 mph in the morning. "/>Sunny<p clas
         s="temp temp-high">High: 95 °F</div>
         #morning.find(class = "period-name").get text()
In [29]:
         period = morning.find(class ="period-name").get text()
In [27]:
         period
         'Today'
Out[27]:
In [31]:
         short desc = morning.find(class ="short-desc").get text()
         short desc
Out[31]:
         'Sunny'
         temp = morning.find(class ="temp").get text()
In [32]:
         temp
Out[32]: 'High: 95 °F'
        Uma opção seria pegar as informações contidas na tag <img>.
```

Out[34]: <img alt="Today: Sunny, with a high near 95. Calm wind becoming west southwest 5 to 9 mph in the morning. " class="forecast-icon" src="newimages/medium/few.p ng" title="Today: Sunny, with a high near 95. Calm wind becoming west southwes t 5 to 9 mph in the morning. "/>

```
In [35]: # Obtem o título (title) da descrição da img
desc = img['title']
desc
```

Out[35]: 'Today: Sunny, with a high near 95. Calm wind becoming west southwest 5 to 9 m ph in the morning. '

### Extraindo toda a informação da página

Agora que sabemos como extrair a informação de um elemento, vamos obter todos os outros.

```
In [37]:
                      seven day
Out[37]: <div class="panel panel-default" id="seven-day-forecast">
                      <div class="panel-heading">
                      <br/>b>Extended Forecast for</b>
                      <h2 class="panel-title">
                                                                      2 Miles NW Clint TX </h2>
                      </div>
                      <div class="panel-body" id="seven-day-forecast-body">
                      <div id="seven-day-forecast-container">
                      -forecast-list">
                      <div class="tombstone-container">
                      Today<br/><br/>
                      <img alt="Today: Sunny, with a high near 95. Calm wind becoming west southw
                      est 5 to 9 mph in the morning. " class="forecast-icon" src="newimages/medium/f
                      ew.png" title="Today: Sunny, with a high near 95. Calm wind becoming west sout
                      hwest 5 to 9 mph in the morning. "/>Sunny<p clas
                      s="temp temp-high">High: 95 °F</div>
                      <div class="tombstone-container">
                      Tonight<br/><br/>
                      <img alt="Tonight: Mostly clear, with a low around 62. West wind 5 to 10 mp</p>
                      h becoming light and variable after midnight. " class="forecast-icon" src="ne
                      wimages/medium/nfew.png" title="Tonight: Mostly clear, with a low around 62. W
                      est wind 5 to 10 mph becoming light and variable % \left( 1\right) =\left( 1\right) +\left( 1\right) +\left
                      ass="short-desc">Mostly ClearLow: 62 °F</div>
                      class="forecast-tombstone">
                      <div class="tombstone-container">
                      Wednesday<br/><br/>
                      <img alt="Wednesday: Mostly sunny, with a high near 96. South wind 5 to 15</p>
                      mph becoming west southwest in the afternoon. " class="forecast-icon" src="new
                      images/medium/sct.png" title="Wednesday: Mostly sunny, with a high near 96. So
                      uth wind 5 to 15 mph becoming west southwest in the afternoon. "/><p class
                      ="short-desc">Mostly SunnyHigh: 96 °F</div>
                      class="forecast-tombstone">
                      <div class="tombstone-container">
                      Wednesday<br/>Night
                      <img alt="Wednesday Night: Partly cloudy, with a low around 64. West southw est wind 5 to 15 mph. " class="forecast-icon" src="newimages/medium/nsct.png"</p>
                      title="Wednesday Night: Partly cloudy, with a low around 64. West southwest wind 5 to 15 mph. "/>Partly Cloudy<p class="temp t
                      emp-low">Low: 64 °F</div>
                      <div class="tombstone-container">
                      Thursday<br/><br/>
                      <img alt="Thursday: Mostly sunny, with a high near 96. Light south southwes"
                      t wind becoming west 11 to 16 mph in the morning. " class="forecast-icon" src
                      ="newimages/medium/sct.png" title="Thursday: Mostly sunny, with a high near 9
                      6. Light south southwest wind becoming west 11 to 16 mph in the morning. "/></
                      p>Mostly SunnyHigh: 96 °F
                      </div>
                      <div class="tombstone-container">
                      Thursday<br/>Night
```

```
to 16 mph decreasing to 5 to 10 mph after midnight. " class="forecast-icon" sr
       c="newimages/medium/nfew.png" title="Thursday Night: Mostly clear, with a low
       around 64. West wind 11 to 16 mph decreasing to 5 to 10 mph after midnight. "/
       >Mostly ClearLow: 64 °F
       </div>
       <div class="tombstone-container">
       Friday<br/><br/>
       <img alt="Friday: Sunny, with a high near 97. West wind 5 to 14 mph. " clas
       s="forecast-icon" src="newimages/medium/few.png" title="Friday: Sunny, with a
       high near 97. West wind 5 to 14 mph. "/>Sunny<p
       class="temp temp-high">High: 97 °F</div>
       e">
       <div class="tombstone-container">
       Friday<br/>Night
       <img alt="Friday Night: Clear, with a low around 64. West wind 7 to 14 mph</p>
       becoming south southwest after midnight. " class="forecast-icon" src="newimage
       s/medium/nskc.png" title="Friday Night: Clear, with a low around 64. West wind
       7 to 14 mph becoming south southwest after midnight. "/><p class="short-de"
       sc">ClearLow: 64 °F</div><li class="fore
       cast-tombstone">
       <div class="tombstone-container">
       Saturday<br/><br/>
       <img alt="Saturday: Sunny, with a high near 100. South wind 7 to 13 mph bec</p>
       oming west in the afternoon. " class="forecast-icon" src="newimages/medium/fe
       w.png" title="Saturday: Sunny, with a high near 100. South wind 7 to 13 mph be
       coming west in the afternoon. "/>Sunny<p class
       ="temp temp-high">High: 100 °F</div></div>
       <script type="text/javascript">
       // equalize forecast heights
       $(function () {
             var maxh = 0;
             $(".forecast-tombstone .short-desc").each(function () {
                   var h = $(this).height();
                   if (h > maxh) \{ maxh = h; \}
             $(".forecast-tombstone .short-desc").height(maxh);
       </script> </div>
       </div>
       <div class="tombstone-container">
          </div>
       <div class="tombstone-container">
          </div>
       <div class="tombstone-container">
          </div>
       seven day.select(".tombstone-container .period-name")
In [36]:
Out[36]: [Today<br/><br/>,
        Tonight<br/><br/>,
        Wednesday<br/><br/>,
        Wednesday<br/>Night,
        Thursday<br/><br/>,
        Thursday<br/>Night,
        Friday<br/><br/>,
```

<img alt="Thursday Night: Mostly clear, with a low around 64. West wind 11</p>

```
Friday<br/>Night,
          Saturday<br/><br/>]
In [41]:
         # Usa o seletor CSS para extrair todos os period-name dentro de tombstone-con
          period tags = seven day.select(".tombstone-container .period-name")
          # Usando list comprehensions (não vimos ainda)
          #periods = [pt.get text() for pt in period tags]
          periods = []
          for pt in period tags:
              periods.append(pt.get text())
          periods
'Wednesday'
          'WednesdayNight',
          'Thursday',
          'ThursdayNight',
          'Friday',
          'FridayNight',
          'Saturday']
        Vamos usar a mesma técnica para os outros três campos.
In [42]:
          # Usando list comprehensions (não vimos ainda)
          #short descs = [sd.get text() for sd in seven day.select(".tombstone-containe
          short descs tags = seven day.select(".tombstone-container .short-desc")
          short descs = []
          for sd in short descs tags:
              short descs.append(sd.get text())
          short descs
Out[42]: ['Sunny',
          'Mostly Clear',
          'Mostly Sunny',
          'Partly Cloudy',
          'Mostly Sunny',
          'Mostly Clear',
          'Sunny',
          'Clear'
          'Sunny']
In [43]:
         # Usando list comprehensions (não vimos ainda)
          # temps = [t.get_text() for t in seven_day.select(".tombstone-container .temp
          temps tags = seven day.select(".tombstone-container .temp")
          temps = []
          for tp in temps_tags:
              temps.append(tp.get_text())
          temps
Out[43]: ['High: 95 °F',
          'Low: 62 °F'
          'High: 96 °F',
          'Low: 64 °F',
          'High: 96 °F',
          'Low: 64 °F',
          'High: 97 °F',
          'Low: 64 °F',
          'High: 100 °F']
In [45]: # Usando list comprehensions (não vimos ainda)
          # descs = [d["title"] for d in seven_day.select(".tombstone-container img")]
```

```
descs_tags = seven_day.select(".tombstone-container img")
descs = []
for d in descs_tags:
    descs.append(d['title'])
descs
```

Out[45]: ['Today: Sunny, with a high near 95. Calm wind becoming west southwest 5 to 9 mph in the morning.',

'Tonight: Mostly clear, with a low around 62. West wind 5 to 10 mph becoming light and variable after midnight.',

'Wednesday: Mostly sunny, with a high near 96. South wind 5 to 15 mph becomin g west southwest in the afternoon. ',

'Wednesday Night: Partly cloudy, with a low around 64. West southwest wind 5 to 15 mph. ',

'Thursday: Mostly sunny, with a high near 96. Light south southwest wind becoming west 11 to 16 mph in the morning. ',

'Thursday Night: Mostly clear, with a low around 64. West wind 11 to 16 mph d ecreasing to 5 to 10 mph after midnight. ',

'Friday: Sunny, with a high near 97. West wind 5 to 14 mph. ',

'Friday Night: Clear, with a low around 64. West wind 7 to 14 mph becoming so uth southwest after midnight. ',

'Saturday: Sunny, with a high near 100. South wind 7 to 13 mph becoming west in the afternoon. ']

### **Pandas**

Um DataFrame é um objeto que pode armazenar dados tabulares, facilitando a análise.

Vamos instanciar uma classe DataFrame e passar a lista de itens que temos. Vamos passar como parte de um dicionário. Cada chave do dicionário irá virar uma coluna no DataFrame e os elementos da lista irão se tornar os valores das colunas.

Out[46]:		Período	Minidescrição	Temperatura	Descrição
	0	Today	Sunny	High: 95 °F	Today: Sunny, with a high near 95. Calm wind b
	1	Tonight	Mostly Clear	Low: 62 °F	Tonight: Mostly clear, with a low around 62. W
	2	Wednesday	Mostly Sunny	High: 96 °F	Wednesday: Mostly sunny, with a high near 96
	3	WednesdayNight	Partly Cloudy	Low: 64 °F	Wednesday Night: Partly cloudy, with a low aro
	4	Thursday	Mostly Sunny	High: 96 °F	Thursday: Mostly sunny, with a high near 96. L
	5	ThursdayNight	Mostly Clear	Low: 64 °F	Thursday Night: Mostly clear, with a low aroun
	6	Friday	Sunny	High: 97 °F	Friday: Sunny, with a high near 97. West wind
	7	FridayNight	Clear	Low: 64 °F	Friday Night: Clear, with a low around 64. Wes

Período	Minidescrição	Temperatura	Descrição
---------	---------------	-------------	-----------

8 Saturday Sunny High: 100 °F Saturday: Sunny, with a high near 100. South w...

Com a tabela anterior, podemos fazer a análise do clima em uma cidade, incluindo as brasileiras.

#### Desafio

Podemos utilizar expressões regulares e o método Series.str.extract para extrair o valor numérico das temperaturas. Esta página oferece uma introdução sobre o tópico.

```
In [47]:
          df_clima_tempo["Temperatura"]
Out[47]: 0
                High: 95 °F
                Low: 62 °F
          2
                High: 96 °F
                Low: 64 °F
               High: 96 °F
                Low: 64 °F
               High: 97 °F
                Low: 64 °F
               High: 100 °F
         Name: Temperatura, dtype: object
         Utilizamos o método Series.str.extract, que utiliza expressões regulares para extrair padrões
         do texto.
In [48]:
          # Neste caso, a expressão regular para extrair os digitos da string
          temp nums = df clima tempo["Temperatura"].str.extract(r"(\d+)", expand=False)
          temp nums
                95
Out[48]: 0
                62
         2
                96
         3
                64
                96
          5
                64
          6
                97
          7
                64
               100
         Name: Temperatura, dtype: object
In [23]:
          # 0 tipo resultante de Series.str.extract
          type(temp nums)
Out[23]: pandas.core.series.Series
          # Converte os valores da coluna temp num em inteiro
In [50]:
          df clima tempo["Temperatura"] = temp nums.astype('int')
          df_clima_tempo["Temperatura"]
Out[50]: 0
                95
                62
                96
         2
                64
         3
         4
                96
         5
                64
          6
                97
                64
          7
               100
          8
         Name: Temperatura, dtype: int64
In [51]: df clima tempo
```

Out[51]:		Período	Minidescrição	Temperatura	Descrição
	0	Today	Sunny	95	Today: Sunny, with a high near 95. Calm wind b
	1	Tonight	Mostly Clear	62	Tonight: Mostly clear, with a low around 62. W
	2	Wednesday	Mostly Sunny	96	Wednesday: Mostly sunny, with a high near 96
	3	WednesdayNight	Partly Cloudy	64	Wednesday Night: Partly cloudy, with a low aro
	4	Thursday	Mostly Sunny	96	Thursday: Mostly sunny, with a high near 96. L
	5	ThursdayNight	Mostly Clear	64	Thursday Night: Mostly clear, with a low aroun
	6	Friday	Sunny	97	Friday: Sunny, with a high near 97. West wind
	7	FridayNight	Clear	64	Friday Night: Clear, with a low around 64. Wes
	8	Saturday	Sunny	100	Saturday: Sunny, with a high near 100. South w

Calcula a média para as temperaturas altas e baixas.

```
In [52]: df_clima_tempo["Temperatura"].mean()
```

Out[52]: 82.0