Appendix A

May 4, 2020

1 Data Scraping

```
[]: from bs4 import BeautifulSoup import urllib.request import pandas as pd import numpy as np import requests
```

1.1 Roster

Read in the roster from masters.com. This includes amatuers, so we need to take those out. Source: https://www.masters.com/en_US/players/invitees_2020.html We copied and pasted the table into an excel sheet and did some initial cleaning.

1.2 Scraping Tournment Data

1.2.1 Get links to all of the tournements in the past 10 years

1.2.2 Extract all tournement links from the table

There are tournement links and player links. Tournement links do not have "player" in the path.

```
[]: tournement_links = {}
   # For each year
   for link in main_links:
       year = link.split('/')[-1]
       tournement_links[year] = []
       source = urllib.request.urlopen(link).read()
       soup = BeautifulSoup(source, 'lxml')
       table_titles = soup.findAll("section", {"class" : "ResponsiveTable"})
       # Find the completed tournements table
       for table in table titles:
           title = table.find("div", {"class" : "Table__Title"})
           if title.text == "Completed Tournaments":
                # This is the one that we want
                # Still saved in table
               break
       links = table.findAll('a', {'class' : "AnchorLink"})
       # get all tournements in the table
       for link in links:
           href = link.attrs['href']
           if "player" not in href.split('/'):
               tournement_links[year].append(href)
```

1.2.3 Parse tournement results

This saves the table from each tournmemnt in a pandas dataframe and saves it to a csv file in the data folder. The data folder has folder for each year which contains a the csv file for each tournement.

```
[]: def get_tournement_results(link):
       source = urllib.request.urlopen(link).read()
       soup = BeautifulSoup(source,'lxml')
       compet_table = soup.find("div", {"class" : "competitors"})
       tables = compet_table.find_all("section", {"class" : "ResponsiveTable"})
       for table in tables:
           #Get headings
           headings = []
           headings_tag = table.find('thead')
           head cells = headings tag.findAll("th")
           if len(head cells) < 8:
                continue
           for heading in headings_tag.findAll("th"):
                    headings.append(heading.find('a').text)
           body = table.find("tbody")
           rows = body.findAll('tr')
           player_data = []
           for row in rows:
               current row = []
               for text in row.findAll("td"):
                    current_row.append(text.text)
               player data.append(current row)
           return [headings] + player_data
[]: data = {}
   failed_links = []
   for year in tournement links:
       for link in tournement_links[year]:
           data[year] = []
           try:
               results = get_tournement_results(link)
               df = pd.DataFrame(results[1:], columns=results[0]).

¬set_index("PLAYER")
               df[['R1', 'R2', 'R3', 'R4']] = df[['R1', 'R2', 'R3', 'R4']].
    →replace("--", np.nan).astype(float)
               df.to_csv('data/' + str(year) + '/' + link.split('=')[-1])
               data[year].append(df)
```

```
except Exception as err:
    failed_links.append(link)
    print(link)
    print(err)
```