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In [1]: ##### Maine Congressional District 2 (2018) Ranked Choice Voting Replication
# by Nathan Tefft, Ph.D., 11/29/2018
# This notebook uses an open source platform to replicate the Maine Congressional District 2 ranked choice voting results certified to the Governor on 11/26/18 (obtained from https://www.maine.gov/sos/cec/elec/results/results18.html#Nov6).
# The replication implements the rank-choiced voting rules as provided in 21-A M.R.S.A. Chapter 723-A, sub-chapter 1, described at https://www.maine.gov/sos/cec/elec/upcoming/pdf/250rcvnew.pdf
# Although the rules allow for a "batch elimination" based on mathematical impossibility (used by the Secretary of State's office), I simply run subsequent instant runoffs to demonstrate the equivalence of the two approaches
# The replication was specifically written for the Maine Congressional District 2 race (2018), so it would need to be modified to replicate other races
# The code may not be particularly efficient, and I hope to one day improve its efficiency, but it transparently implements the process for those familiar with the Python Language

# Import packages for mathematical operations (numpy) and data manipulation (pandas)

import numpy
import pandas
```

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In [2]: # Import the cleaned ballot data from the Maine Secretary of State's web site
        (https://www.maine.gov/sos/cec/elec/results/results18.html#Nov6)

ballots = pandas.read_excel('Nov18CVRExportFINAL1.xlsx').rename(index=str, columns={"Rep. to Congress 1st Choice District 2": "choice1", "Rep. to Congress 2nd Choice District 2": "choice2", "Rep. to Congress 3rd Choice District 2": "choice3", "Rep. to Congress 4th Choice District 2": "choice4", "Rep. to Congress 5th Choice District 2": "choice5"})
ballots = ballots.append(pandas.read_excel('Nov18CVRExportFINAL2.xlsx').rename(index=str, columns={"Rep. to Congress 1st Choice District 2": "choice1", "Rep. to Congress 2nd Choice District 2": "choice2", "Rep. to Congress 3rd Choice District 2": "choice3", "Rep. to Congress 4th Choice District 2": "choice4", "Rep. to Congress 5th Choice District 2": "choice5"}), sort=True)
ballots = ballots.append(pandas.read_excel('Nov18CVRExportFINAL3.xlsx').rename(index=str, columns={"Rep. to Congress 1st Choice District 2": "choice1", "Rep. to Congress 2nd Choice District 2": "choice2", "Rep. to Congress 3rd Choice District 2": "choice3", "Rep. to Congress 4th Choice District 2": "choice4", "Rep. to Congress 5th Choice District 2": "choice5"}), sort=True)
ballots = ballots.append(pandas.read_excel('UOCAVA-FINALRepCD2.xlsx').rename(index=str, columns={"Rep. to Congress District 2 1st Choice": "choice1", "Rep. to Congress District 2 2nd Choice": "choice2", "Rep. to Congress District 2 3rd Choice": "choice3", "Rep. to Congress District 2 4th Choice": "choice4", "Rep. to Congress District 2 5th Choice": "choice5"}), sort=True)
ballots = ballots.append(pandas.read_excel('UOCAVA-AUX-CVRRepCD2.xlsx').rename(index=str, columns={"Rep. to Congress District 2 1st Choice": "choice1", "Rep. to Congress District 2 2nd Choice": "choice2", "Rep. to Congress District 2 3rd Choice": "choice3", "Rep. to Congress District 2 4th Choice": "choice4", "Rep. to Congress District 2 5th Choice": "choice5"}), sort=True)
ballots = ballots.append(pandas.read_excel('UOCAVA2CVRRepCD2.xlsx').rename(index=str, columns={"Rep. to Congress District 2 1st Choice": "choice1", "Rep. to Congress District 2 2nd Choice": "choice2", "Rep. to Congress District 2 3rd Choice": "choice3", "Rep. to Congress District 2 4th Choice": "choice4", "Rep. to Congress District 2 5th Choice": "choice5"}), sort=True)
ballots = ballots.append(pandas.read_excel('AUXCVRProofedCVR95RepCD2.xlsx').rename(index=str, columns={"Rep. to Congress District 2 1st Choice": "choice1", "Rep. to Congress District 2 2nd Choice": "choice2", "Rep. to Congress District 2 3rd Choice": "choice3", "Rep. to Congress District 2 4th Choice": "choice4", "Rep. to Congress District 2 5th Choice": "choice5"}), sort=True)
ballots = ballots.append(pandas.read_excel('RepCD2-8final.xlsx').rename(index=str, columns={"Rep. to Congress 1st Choice District 2": "choice1", "Rep. to Congress 2nd Choice District 2": "choice2", "Rep. to Congress 3rd Choice District 2": "choice3", "Rep. to Congress 4th Choice District 2": "choice4", "Rep. to Congress 5th Choice District 2": "choice5"}), sort=True)
```

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In [3]: # Remove extra characters and spaces from candidate names, and store ballots in choices dataframe for rules implementation
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choices = pandas.DataFrame()
choices['1'] = ballots['choice1'].str.replace("\(5931\)", "").str.replace("\(5471\)", "").str.strip()
choices['2'] = ballots['choice2'].str.strip()
choices['3'] = ballots['choice3'].str.strip()
choices['4'] = ballots['choice4'].str.strip()
choices['5'] = ballots['choice5'].str.strip()
```

In [4]: *# Count the total number of ballots to tabulate*

```
choices['1'].count()
```

Out[4]: 296077

In [5]: *# Tabulate the raw counts of first round choices*

```
choices['1'].value_counts()
```

```
Out[5]: REP Poliquin, Bruce      133993
DEM Golden, Jared F.        131822
Bond, Tiffany L.           16415
Hoar, William R.S.         6782
undervote                   6641
overvote                     424
Name: 1, dtype: int64
```

In [6]: *# Tabulate the raw percents of first round choices*

```
100*choices['1'].value_counts()/choices['1'].value_counts().sum()
```

```
Out[6]: REP Poliquin, Bruce      45.256133
DEM Golden, Jared F.        44.522877
Bond, Tiffany L.           5.544166
Hoar, William R.S.         2.290620
undervote                   2.242998
overvote                     0.143206
Name: 1, dtype: float64
```

In [7]: *# Before conducting the first instant runoff, implement rules regarding missing and multiple votes per rank (as provided in 21-A M.R.S.A. Chapter 723-A, sub-chapter 1, described at <https://www.maine.gov/sos/cec/elec/upcoming/pdf/250rcvnew.pdf>)*

*# Two consecutive skipped rankings: When a voter does not mark two or more consecutive rankings, then the ballot is deemed exhausted for that contest, and no subsequent candidate rankings on that ballot are counted*

```
choices['3'] = numpy.where(choices['1'].str.contains('undervote') & choices['2'].str.contains('undervote'),'invalidated',choices['3'])
choices['4'] = numpy.where(choices['3'].str.contains('invalidated') | (choices['2'].str.contains('undervote') & choices['3'].str.contains('undervote')),'invalidated',choices['4'])
choices['5'] = numpy.where(choices['3'].str.contains('invalidated') | choices['4'].str.contains('invalidated') | (choices['3'].str.contains('undervote') & choices['4'].str.contains('undervote')),'invalidated',choices['5'])
```

In [8]: *# An overvote (when a voter marks more than one candidate for the same ranking) invalidates the overvoted rankings and all subsequent rankings marked for that contest on the ballot.*

```
choices['2'] = numpy.where(choices['1'].str.contains('overvote|invalidated'),
'invalidated',choices['2'])
choices['3'] = numpy.where(choices['2'].str.contains('overvote|invalidated'),
'invalidated',choices['3'])
choices['4'] = numpy.where(choices['3'].str.contains('overvote|invalidated'),
'invalidated',choices['4'])
choices['5'] = numpy.where(choices['4'].str.contains('overvote|invalidated'),
'invalidated',choices['5'])
```

In [9]: *#### FIRST ROUND (ZERO RUNOFF)*  
*# Being with the "zero" runoff, which tallies the first choice, moving to the second choice if there is a single undervote, according to the "single skippe d ranking" rule*

```
choices['runoff0'] = numpy.where(choices['1'].str.contains('undervote'),choices['2'],choices['1'])
```

*# Tabulate all ballot statuses after this runoff*  
choices['runoff0'].value\_counts()

Out[9]:

REP Poliquin, Bruce	134184
DEM Golden, Jared F.	132013
Bond, Tiffany L.	16552
Hoar, William R.S.	6875
undervote	6018
overvote	435

Name: runoff0, dtype: int64

In [10]: *# Mark ballots that are counted in this runoff as "continuing"*  
choices['continuing0'] = ~choices['runoff0'].isin(['exhausted','overvote','undervote','invalidated'])

*# Total of ballots that are counted in this runoff*  
choices['continuing0'].value\_counts()

Out[10]:

True	289624
False	6453

Name: continuing0, dtype: int64

In [11]: *# Calculate and display percents of vote for each candidate among ballots counted in this runoff*

```
counts0 = choices.loc[choices['continuing0']]['runoff0'].value_counts()
100*counts0/counts0.sum()
```

Out[11]:

REP Poliquin, Bruce	46.330415
DEM Golden, Jared F.	45.580822
Bond, Tiffany L.	5.714996
Hoar, William R.S.	2.373767

Name: runoff0, dtype: float64

```
In [12]: ##### FIRST AUTOMATIC RUNOFF
# Using the results from the first round, eliminate the last place vote-getter
# by assigning their voters' next-highest ranked choice, according to the rules
# referenced above

choices['runoff1'] = choices['runoff0']
choices['runoff1'] = numpy.where(choices['runoff1'].str.contains('undervote|Ho
ar, William R.S.'),choices['2'],choices['runoff1'])
choices['runoff1'] = numpy.where(choices['runoff1'].str.contains('undervote|Ho
ar, William R.S.'),choices['3'],choices['runoff1'])
choices['runoff1'] = numpy.where(choices['runoff1'].str.contains('undervote|Ho
ar, William R.S.'),choices['4'],choices['runoff1'])
choices['runoff1'] = numpy.where(choices['runoff1'].str.contains('undervote|Ho
ar, William R.S.'),choices['5'],choices['runoff1'])
choices['runoff1'] = numpy.where(choices['runoff1'].str.contains('Hoar, Willia
m R.S.'),'exhausted',choices['runoff1'])

# Tabulate all ballot statuses after this runoff
choices['runoff1'].value_counts()
```

```
Out[12]: REP Poliquin, Bruce      135073
DEM Golden, Jared F.      133216
Bond, Tiffany L.          19173
invalidated                8056
overvote                   456
exhausted                  94
undervote                   9
Name: runoff1, dtype: int64
```

```
In [13]: # Mark ballots that are counted in this runoff as "continuing"
choices['continuing1'] = ~choices['runoff1'].isin(['exhausted','overvote','und
ervote','invalidated'])

# Total of ballots that are counted in this runoff
choices['continuing1'].value_counts()
```

```
Out[13]: True      287462
False      8615
Name: continuing1, dtype: int64
```

```
In [14]: # Calculate and display percents of vote for each candidate among coun
ted in this runoff
counts1 = choices.loc[choices['continuing1']]['runoff1'].value_counts()
100*counts1/counts1.sum()
```

```
Out[14]: REP Poliquin, Bruce      46.988124
DEM Golden, Jared F.      46.342125
Bond, Tiffany L.          6.669751
Name: runoff1, dtype: float64
```

```
In [15]: ##### SECOND AUTOMATIC RUNOFF
# Using the results from the first runoff, eliminate the last place vote-getter
# by assigning their voters' next-highest ranked choice, according to the rules
# referenced above

choices['runoff2'] = choices['runoff1']
choices['runoff2'] = numpy.where(choices['runoff2'].str.contains('undervote|Hoar,
William R.S.|Bond, Tiffany L.'),choices['2'],choices['runoff2'])
choices['runoff2'] = numpy.where(choices['runoff2'].str.contains('undervote|Hoar,
William R.S.|Bond, Tiffany L.'),choices['3'],choices['runoff2'])
choices['runoff2'] = numpy.where(choices['runoff2'].str.contains('undervote|Hoar,
William R.S.|Bond, Tiffany L.'),choices['4'],choices['runoff2'])
choices['runoff2'] = numpy.where(choices['runoff2'].str.contains('undervote|Hoar,
William R.S.|Bond, Tiffany L.'),choices['5'],choices['runoff2'])
choices['runoff2'] = numpy.where(choices['runoff2'].str.contains('Hoar, William
R.S.|Bond, Tiffany L.'),'exhausted',choices['runoff2'])

# Tabulate all ballot statuses after this runoff
choices['runoff2'].value_counts()
```

```
Out[15]: DEM Golden, Jared F.    142440
REP Poliquin, Bruce    138931
invalidated            13745
overvote                533
exhausted              342
undervote               86
Name: runoff2, dtype: int64
```

```
In [16]: # Mark ballots that are counted in this runoff as "continuing"
choices['continuing2'] = ~choices['runoff2'].isin(['exhausted','overvote','undervote',
'invalidated'])

# Total of ballots that are counted in this runoff
choices['continuing2'].value_counts()
```

```
Out[16]: True      281371
False    14706
Name: continuing2, dtype: int64
```

```
In [17]: # Calculate and display percents of vote for each candidate among ballots
# counted in this runoff
counts2 = choices.loc[choices['continuing2']]['runoff2'].value_counts()
100*counts2/counts2.sum()
```

```
Out[17]: DEM Golden, Jared F.    50.623554
REP Poliquin, Bruce    49.376446
Name: runoff2, dtype: float64
```