Interpolation Methods

This notebook will compare 4 Interpolation methods in Arc Pro. First, I will use code from Jeffey Bishop to extract the data. Then, I will reshape the table and export it to points. Finally, I will perform inverse distance weighting and kriging to compare the results.

```
In [1]: import pandas as pd
        import requests
        from datetime import date
        from io import StringIO
        class ndawn request:
            def __init__(self, startDate='YYYY-MM-DD', endDate='YYYY-MM-DD', on
        tology = None, location = None, save = False):
                self.start = startDate
                self.end = endDate
                # List of ontology terms, and their URL codes to build request
        URL
                self.ontology = {
                     'Air Temperature': ['variable=hdt', 'variable=hdt9'],
                     'Relative Humidity': ['variable=hdrh', 'variable=hdrh9'],
                     'Soil Temperature': ['variable=hdbst', 'variable=hdtst'],
                     'Wind Speed': ['variable=hdws', 'variable=hdmxws', 'variabl
        e=hdws10', 'variable=hdmxws10'],
                     'Wind Direction': ['variable=hdwd', 'variable=hdsdwd', '&va
        riable=hdwd10', 'variable=hdsdwd10'],
                    'Solar Radiation': ['variable=hdsr'],
                    'Rainfall': ['variable=hdr'],
                     'Air Pressure': ['variable=hdbp'],
                    'Dew Point': ['variable=hddp'],
                     'Wind Chill': ['variable=hdwc']
                # Concatenate the ontology keys into a list for exception print
        out later
                ontologiesErrorMessage = '\n'.join(list(self.ontology.keys()))
                # List of stations, and URL codes to build request URL
                self.stations = {
                    'Ada': 78,
                     'Becker': 118,
                     'Campbell': 87,
                     'Clarissa': 124,
                     'Eldred': 2,
                     'Fox': 93,
                     'Greenbush': 70,
                     'Hubbard': 119,
                     'Humboldt': 4,
                     'Kennedy': 82,
                     'Little Falls': 120,
                     'Mavie': 71,
                     'Ottertail': 103,
                     'Parkers Prairie': 116,
                     'Perham': 114,
                     'Perley': 3,
                     'Pine Point': 115,
```

```
'Rice': 121,
            'Roseau': 61,
            'Sabin': 60,
            'Staples': 122,
            'Stephen': 5,
            'Ulen': 91,
            'Wadena': 117,
            'Warren': 6,
            'Waukon': 92,
            'Westport': 123,
            'Williams': 95
        # Concatenate station names into a list for exception printout
later
        stationsErrorMessage = '\n'.join(list(self.stations.keys()))
        self.save = save
        # This checks the start and end dates supplied to make sure the
y are valid
        # Start by converting dates into iso format
        startDateCheck = date.fromisoformat(startDate)
        endDateCheck = date.fromisoformat(endDate)
        # If start date is after end date, raise exception
        if startDateCheck > endDateCheck:
            raise Exception('End date cannot be before start date')
        # Create empty list to hold URL codes for ontology terms
        self.activeMeasures = []
        # If user supplies ontology terms
        if ontology is not None:
            for item in ontology:
                # If user-supplied term is not in the dictionary, raise
exception
                if item not in self.ontology.keys():
                    raise Exception('Ontology term [' + str(item) + ']
not recognized. Available ontology terms include: ' + '\n' + ontologies
ErrorMessage)
                # Otherwise, append URL codes for ontology terms into t
he list of measurements to be requested
                else:
                    for code in self.ontology[item]:
                        self.activeMeasures.append(code)
        # If user does not supply ontology terms, add all URL codes in
dictionary to the list of measurements to be requested
        else:
            for key in self.ontology:
                for code in self.ontology[key]:
                    self.activeMeasures.append(code)
        # Create empty list to hold URL codes for stations
        self.activeStations = []
        # If user supplies station names
        if location is not None:
```

```
for name in location:
                # If user-supplied name is not in the dictionary, raise
exception
                if name not in self.stations.keys():
                    raise Exception('Station [' + str(name) + '] not re
cognized. Available stations include: ' + '\n' + stationsErrorMessage)
                # Otherwise, append URL codes for stations into the lis
t of stations to be requested
                else:
                    self.activeStations.append('station=' + str(self.st
ations[name]))
        # If user does not supply station names, add all station URL co
des in dictionary to the list of stations to be requested
        else:
            for key in self.stations:
                self.activeStations.append('station=' + str(self.statio
ns[key]))
   def get data(self):
        # Construct API call for the request
       baseURL = 'https://ndawn.ndsu.nodak.edu/table.csv?'
        stations = '&'.join(self.activeStations)
        measurements = '&'.join(self.activeMeasures)
        options = '&ttype=hourly&quick pick=&begin date=' + self.start
+ '&end date=' + self.end
        finalURL = str(baseURL + stations + '&' + measurements + option
s)
        # Request page
       page = requests.get(finalURL)
        # If status code not 200, raise exception
        if page.status code != 200:
            raise Exception('URL request status not 200. Status code =
' + page.status code)
       print('Request successful')
        # Convert csv data to string
        content = str(page.content)
        # Remove large, unnecessary header
        trimContent = content[content.find('Station'):len(content)]
        # Replace newline/return with string literal newline
        formatContent = trimContent.replace('\\r\\n', '\n')
        # Convert content to file object
        contentFile = StringIO(formatContent)
        # Read content into pandas dataframe. Second header row contain
s units
        ndawnData = pd.read csv(contentFile, header = [0, 1])
        # Concatenate headers to include units
        # Assign column list to object
        columnHeaders = list(ndawnData.columns)
```

```
newHeaderList = []
                # Iterate through column names
                for number in range(0, len(columnHeaders)):
                     # If no unit, keep header unchanged, pass into new list
                    if 'Unnamed' in columnHeaders[number][1]:
                        newHeaderList.append(columnHeaders[number][0])
                    # If unit exists, concatenate header and unit, pass into ne
        w list
                    else:
                        newHeader = columnHeaders[number][0] + ' (' + columnHea
        ders[number][1] + ') '
                        newHeaderList.append(newHeader)
                # Assign new column names
                ndawnData.columns = newHeaderList
                # Create single column for datetime
                ndawnData['Date'] = pd.to datetime(ndawnData[['Year', 'Month',
        'Day']])
                # Save to csv if save option selected
                if self.save:
                    ndawnData.to csv('ndawnData.csv', index=False)
                return ndawnData
        111
        # Example syntax:
        exampleRequest = ndawn_request(startDate='2020-06-23', endDate='2020-06
        -28', ontology=['Air Pressure', 'Relative Humidity', 'Soil Temperature
        ', 'Wind Direction', 'Wind Speed'], location=['Mavie', 'Ottertail', 'Pe
        rham', 'Perley'])
        ndawnDF = exampleRequest.get data()
Out[1]: "\n# Example syntax:\nexampleRequest = ndawn request(startDate='2020-
        06-23', endDate='2020-06-28', ontology=['Air Pressure', 'Relative Hum
        idity', 'Soil Temperature', 'Wind Direction', 'Wind Speed'], location
        =['Mavie', 'Ottertail', 'Perham', 'Perley'])\nndawnDF = exampleReques
        t.get data() \n"
In [2]: from datetime import timedelta ## importing time deltal for the start a
        nd end date
In [5]: data = ndawn request(startDate= str(date.today() - timedelta(30)), endD
        ate= str(date.today()), ontology=['Air Temperature'], location=['Ada','
        Becker', 'Campbell', 'Clarissa', 'Eldred', 'Fox', 'Greenbush', 'Hubbard', 'Hu
        mboldt', 'Kennedy','Little Falls','Mavie','Ottertail','Parkers Prairie
        ','Perham','Perley','Pine Point','Rice', 'Roseau','Sabin','Staples', 'S
        tephen', 'Ulen', 'Wadena', 'Warren', 'Waukon', 'Westport', 'Williams'])
        ndawnDF = data.get data()
        Request successful
```

List of new headers

```
In [6]: ndawnDF ##Dataframe
```

Out[6]:

	Station Name	Latitude (deg)	Longitude (deg)	Elevation (ft)	Year	Month	Day	Hour (CST)	Avg Air Temp (Degrees F)	Avį Ai Temį Flaį
0	Ada	47.321100	-96.513900	910.0	2021.0	3.0	18.0	100.0	21.916	NaN
1	Ada	47.321100	-96.513900	910.0	2021.0	3.0	18.0	200.0	20.800	NaN
2	Ada	47.321100	-96.513900	910.0	2021.0	3.0	18.0	300.0	19.891	NaN
3	Ada	47.321100	-96.513900	910.0	2021.0	3.0	18.0	400.0	17.884	NaN
4	Ada	47.321100	-96.513900	910.0	2021.0	3.0	18.0	500.0	16.232	NaN
20156	Williams	48.858454	-94.980897	1093.0	2021.0	4.0	16.0	2100.0	40.876	NaN
20157	Williams	48.858454	-94.980897	1093.0	2021.0	4.0	16.0	2200.0	38.500	NaN
20158	Williams	48.858454	-94.980897	1093.0	2021.0	4.0	16.0	2300.0	36.037	NaN
20159	Williams	48.858454	-94.980897	1093.0	2021.0	4.0	16.0	2400.0	35.893	NaN
20160	1	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN

20161 rows × 13 columns

```
In [7]: for i in ndawnDF:
    print(i)
```

```
Station Name
Latitude (deg)
Longitude (deg)
Elevation (ft)
Year
Month
Day
Hour (CST)
Avg Air Temp (Degrees F)
Avg Air Temp Flag
Avg Air Temp at 9 m (Degrees F)
Avg Air Temp at 9 m Flag
Date
```

In [9]: avetemp ##Reshaped so that it just has station, lat, long, and average
30 day temp

Out[9]:

Latitude (deg) Longitude (deg) Avg Air Temp (Degrees F)

Station Name

•	NaN	NaN	NaN
Ada	47.321100	-96.513900	39.498304
Becker	45.344300	-93.850000	43.157939
Campbell	46.064932	-96.370165	40.354461
Clarissa	46.111560	-94.905800	40.578671
Eldred	47.688000	-96.822000	38.602726
Fox	48.877738	-95.850160	37.903894
Greenbush	48.704000	-96.325000	37.413475
Hubbard	46.820590	-94.995800	39.480175
Humboldt	48.884000	-97.150000	36.644451
Kennedy	48.636709	-97.041117	38.092289
Little Falls	45.932130	-94.251400	41.386361
Mavie	48.121000	-95.971000	38.488503
Ottertail	46.426430	-95.573500	40.046131
Parkers Prairie	46.169400	-95.356000	39.957750
Perham	46.610477	-95.601876	39.854543
Perley	47.179000	-96.680000	39.514340
Pine Point	47.012860	-95.371700	38.849354
Rice	45.793830	-94.261800	42.127231
Roseau	48.685000	-95.734000	38.243338
Sabin	46.794389	-96.611683	40.048608
Staples	46.387730	-94.808700	40.522642
Stephen	48.456750	-96.853953	38.116468
Ulen	47.050473	-96.108432	38.723399
Wadena	46.448300	-95.214200	39.936493
Warren	48.137000	-96.839000	37.574749
Waukon	47.325859	-96.132504	39.043386
Westport	45.715080	-95.171800	40.371417
Williams	48.858454	-94.980897	36.895550

Out[21]:

Output

D:/Users/Owner/Documents/ArcGIS/Projects/Arc Lab4/Arc Lab4.gdb\Data

Messages

Start Time: Saturday, April 17, 2021 4:20:58 PM Succeeded at Saturday, April 17, 2021 4:20:58 PM (Elapsed Time: 0.55 seconds)

```
In [22]: arcpy.management.XYTableToPoint("Data", r"D:\Users\Owner\Documents\ArcG
IS\Projects\Arc_Lab4\Arc_Lab4.gdb\Data_Points", "Longitude__deg__", "Lat
itude__deg__", None, "GEOGCS['GCS_WGS_1984',DATUM['D_WGS_1984',SPHEROID
['WGS_1984',6378137.0,298.257223563]],PRIMEM['Greenwich',0.0],UNIT['Deg
ree',0.0174532925199433]];-400 -400 1000000000;-100000 10000;-100000 10
000;8.98315284119521E-09;0.001;0.001;IsHighPrecision") ##Table to xy po
ints
```

Out[22]:

Output

D:\Users\Owner\Documents\ArcGIS\Projects\Arc Lab4\Arc Lab4.gdb\Data Points

Messages

Start Time: Saturday, April 17, 2021 4:21:00 PM

WARNING 100160: Some of the features have invalid geometry and have been removed

from the result

WARNING 000192: Invalid value for rows: 1

Succeeded at Saturday, April 17, 2021 4:21:02 PM (Elapsed Time: 1.76 seconds)

Out[31]:

Output

```
    id value
    D:/Users/Owner/Documents/ArcGIS/Projects/Arc_Lab4/Arc_Lab4.gdb\Kriging_Data2
    1
```

Messages

Start Time: Saturday, April 17, 2021 4:49:53 PM

SPHERICAL

Lag size = nan(snan)
Partial sill = nan(snan)
Nugget = nan(snan)

Major range = nan(snan)

Succeeded at Saturday, April 17, 2021 4:49:54 PM (Elapsed Time: 1.45 seconds)

```
In [3]: out_surface_raster = arcpy.sa.Kriging("Data_Points", "Avg_Air_Temp__Deg
    rees_F_", "LinearDrift 0.013200 # # #", 0.0132, "VARIABLE 12", None); o
    ut_surface_raster.save(r"D:\Users\Owner\Documents\ArcGIS\Projects\Arc_L
    ab4\Arc_Lab4.gdb\Universal_ras")

##Universal Kriging
##This code works but it does not produce the same results as the stati
    stical analysis
```

In [4]: arcpy.ga.EmpiricalBayesianKriging("Data_Points", "Avg_Air_Temp__Degrees
 F", "EBK_STAT", r"D:\Users\Owner\Documents\ArcGIS\Projects\Arc_Lab4\A
 rc_Lab4.gdb\EBK_Rast", 0.0132, "NONE", 100, 1, 100, "NBRTYPE=StandardCi
 rcular RADIUS=1.20984183082956 ANGLE=0 NBR_MAX=15 NBR_MIN=10 SECTOR_TYP
 E=ONE_SECTOR", "PREDICTION", 0.5, "EXCEED", None, "POWER") ##Empirical
 Bayesian Kriging.

Out[4]:

Output

```
id value
```

- 0 a Layer object
- 1 D:\Users\Owner\Documents\ArcGIS\Projects\Arc Lab4\Arc Lab4.gdb\EBK Rast

Messages

Start Time: Sunday, April 18, 2021 10:09:49 PM

Warning(s) for dataset: Length of the radius of the search circle = 1.3468e+05 meters. Succeeded at Sunday, April 18, 2021 10:09:59 PM (Elapsed Time: 9.99 seconds)

In []:	1.	
T11 [] •		