

EDA

March 31, 2023

```
[1]: import matplotlib
import matplotlib.pyplot as plt
import numpy as np
import pandas as pd
import seaborn as sns
import statsmodels.api as sm

%matplotlib inline
```

```
[2]: df_in = pd.read_csv('Austin_Animal_Center_Intakes.csv')
df_in.head()
```

```
[2]:
```

	Animal ID	Name	DateTime	MonthYear	\
0	A665644	NaN	10/21/2013 07:59:00 AM	October 2013	
1	A665739	*Alana	10/22/2013 11:11:00 AM	October 2013	
2	A665763	NaN	10/22/2013 03:10:00 PM	October 2013	
3	A379998	Disciple	10/23/2013 11:42:00 AM	October 2013	
4	A634503	Otter	10/01/2013 02:49:00 PM	October 2013	

	Found Location	Intake Type	\
0	Austin (TX)	Stray	
1	Austin (TX)	Stray	
2	E Riverside Dr/Royal Crest Dr in Austin (TX)	Stray	
3	51St And Grover in Austin (TX)	Stray	
4	Manor (TX)	Owner Surrender	

	Intake Condition	Animal Type	Sex upon Intake	Age upon Intake	\
0	Sick	Cat	Intact Female	4 weeks	
1	Normal	Cat	Intact Female	1 month	
2	Normal	Dog	Intact Male	4 months	
3	Normal	Dog	Intact Male	10 years	
4	Normal	Dog	Spayed Female	2 years	

	Breed	Color
0	Domestic Shorthair Mix	Calico
1	Domestic Medium Hair Mix	Black
2	Cairn Terrier Mix	Tan/White

3	Pit Bull	Black
4	Norfolk Terrier Mix	Tan

1 Preparing the data

```
[3]: df_out = pd.read_csv('Austin_Animal_Center_Outcomes.csv')
df_out.head()
```

```
[3]:
```

	Animal ID	Name	DateTime	MonthYear	Date of Birth	\
0	A794011	Chunk	05/08/2019 06:20:00 PM	May 2019	05/02/2017	
1	A776359	Gizmo	07/18/2018 04:02:00 PM	Jul 2018	07/12/2017	
2	A821648	NaN	08/16/2020 11:38:00 AM	Aug 2020	08/16/2019	
3	A720371	Moose	02/13/2016 05:59:00 PM	Feb 2016	10/08/2015	
4	A674754	NaN	03/18/2014 11:47:00 AM	Mar 2014	03/12/2014	

	Outcome Type	Outcome Subtype	Animal Type	Sex upon Outcome	Age upon Outcome	\
0	Rto-Adopt	NaN	Cat	Neutered Male	2 years	
1	Adoption	NaN	Dog	Neutered Male	1 year	
2	Euthanasia	NaN	Other	Unknown	1 year	
3	Adoption	NaN	Dog	Neutered Male	4 months	
4	Transfer	Partner	Cat	Intact Male	6 days	

	Breed	Color
0	Domestic Shorthair Mix	Brown Tabby/White
1	Chihuahua Shorthair Mix	White/Brown
2	Raccoon	Gray
3	Anatol Shepherd/Labrador Retriever	Buff
4	Domestic Shorthair Mix	Orange Tabby

```
[4]: df_out = df_out.convert_dtypes(infer_objects=True)
df_out['DateTime'] = pd.to_datetime(df_out['DateTime'])
df_out['Date of Birth'] = pd.to_datetime(df_out['Date of Birth'])
df_out.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 149511 entries, 0 to 149510
Data columns (total 12 columns):
#   Column                Non-Null Count  Dtype
---  -
0   Animal ID             149511 non-null string
1   Name                  106260 non-null string
2   DateTime              149511 non-null datetime64[ns]
3   MonthYear             149511 non-null string
4   Date of Birth         149511 non-null datetime64[ns]
5   Outcome Type          149485 non-null string
6   Outcome Subtype       68443 non-null  string
```

```

7   Animal Type      149511 non-null  string
8   Sex upon Outcome 149509 non-null  string
9   Age upon Outcome 149465 non-null  string
10  Breed            149511 non-null  string
11  Color            149511 non-null  string
dtypes: datetime64[ns](2), string(10)
memory usage: 13.7 MB

```

1.1 Colors

```

[5]: from math import pi

# colors.csv was compiled from these wikipedia articles
# https://en.wikipedia.org/wiki/List_of_colors:_A-F
# https://en.wikipedia.org/wiki/List_of_colors:_G%E2%80%93M
# https://en.wikipedia.org/wiki/List_of_colors:_N%E2%80%93Z
# Then the "-" character was replaced with "0"
df_colors = pd.read_csv('colors.csv')
df_colors = df_colors.convert_dtypes(infer_objects=True)
df_colors['Name'] = df_colors['Name'].str.lower()
df_colors['Red (RGB)'] = pd.to_numeric(df_colors['Red (RGB)'].str.replace('%', '\u2192')).div(100)
df_colors['Green (RGB)'] = pd.to_numeric(df_colors['Green (RGB)'].str.replace('%', '\u2192')).div(100)
df_colors['Blue (RGB)'] = pd.to_numeric(df_colors['Blue (RGB)'].str.replace('%', '\u2192')).div(100)
df_colors['Hue (HSL/HSV)'] = pd.to_numeric(df_colors['Hue (HSL/HSV)'].str.replace('°', '\u2192')).div(360)
df_colors['Satur. (HSL)'] = pd.to_numeric(df_colors['Satur. (HSL)'].str.replace('%', '\u2192')).div(100)
df_colors['Light (HSL)'] = pd.to_numeric(df_colors['Light (HSL)'].str.replace('%', '\u2192')).div(100)
df_colors['Satur. (HSV)'] = pd.to_numeric(df_colors['Satur. (HSV)'].str.replace('%', '\u2192')).div(100)
df_colors['Value (HSV)'] = pd.to_numeric(df_colors['Value (HSV)'].str.replace('%', '\u2192')).div(100)
df_colors.head()

```

```

[5]:
      Name Hex (RGB)  Red (RGB)  Green (RGB)  Blue (RGB) \
0  absolute zero  #0048BA    0.00      0.28      0.73
1    acid green  #B0BF1A    0.69      0.75      0.10
2        aero  #7CB9E8    0.49      0.73      0.91
3  african violet  #B284BE    0.70      0.52      0.75
4  air superiority blue  #72A0C1    0.45      0.63      0.76

      Hue (HSL/HSV)  Satur. (HSL)  Light (HSL)  Satur. (HSV)  Value (HSV) \
0      0.602778      1.00      0.37      1.00      0.73

```

1	0.180556	0.76	0.43	0.76	0.43
2	0.572222	0.70	0.70	0.47	0.91
3	0.800000	0.31	0.63	0.31	0.75
4	0.569444	0.39	0.60	0.41	0.76

	Source
0	Crayola
1	Art Paints YG07S
2	Maerz and Paul
3	Pantone
4	Federal Standard 595

Since we will look for correlations with the color variables for the animals, we want to account for the fact that those color variables are drawn from this dataset, and so there could be a sampling bias in how the colors are interpreted.

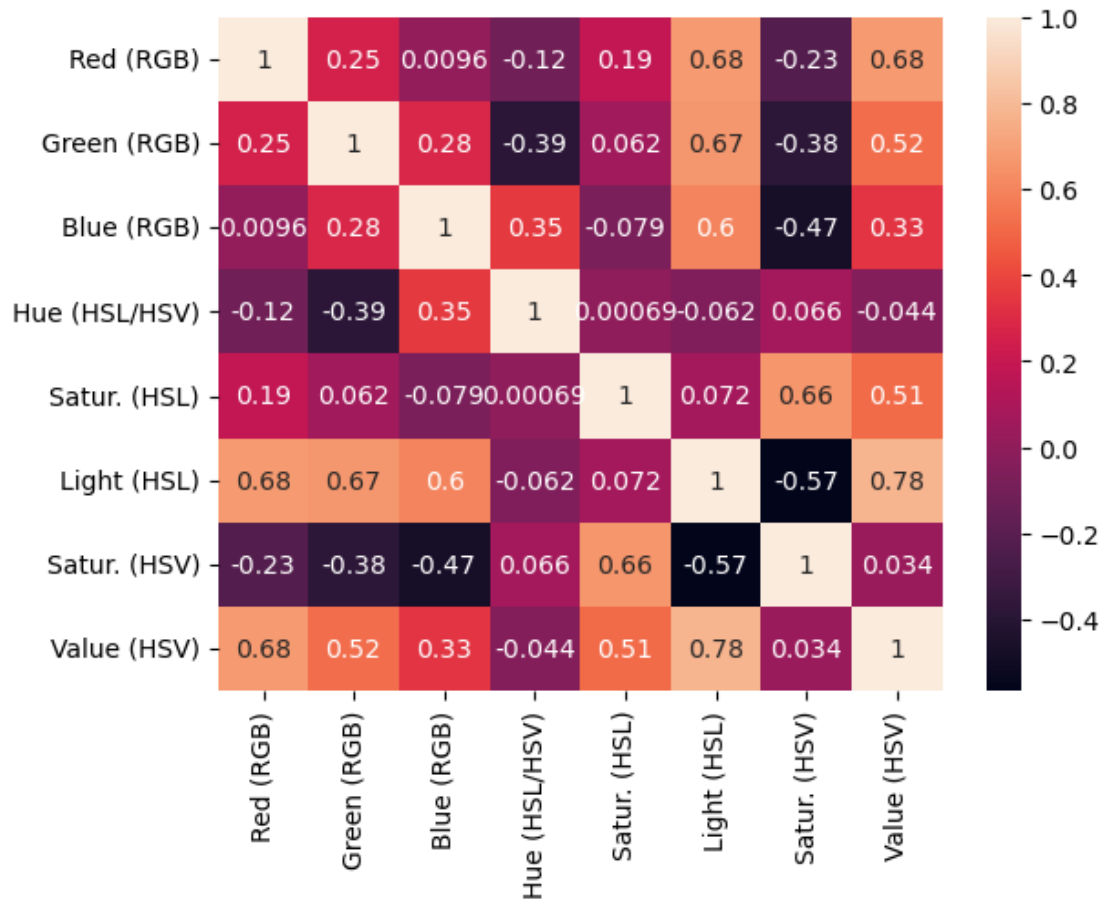
Here, it looks like there is a weak correlation between red and green and between green and blue, but red and blue are mostly unrelated.

```
[6]: sns.heatmap(data=df_colors.corr(), annot=True)
```

```
/tmp/ipykernel_29164/3282312412.py:1: FutureWarning: The default value of
numeric_only in DataFrame.corr is deprecated. In a future version, it will
default to False. Select only valid columns or specify the value of numeric_only
to silence this warning.
```

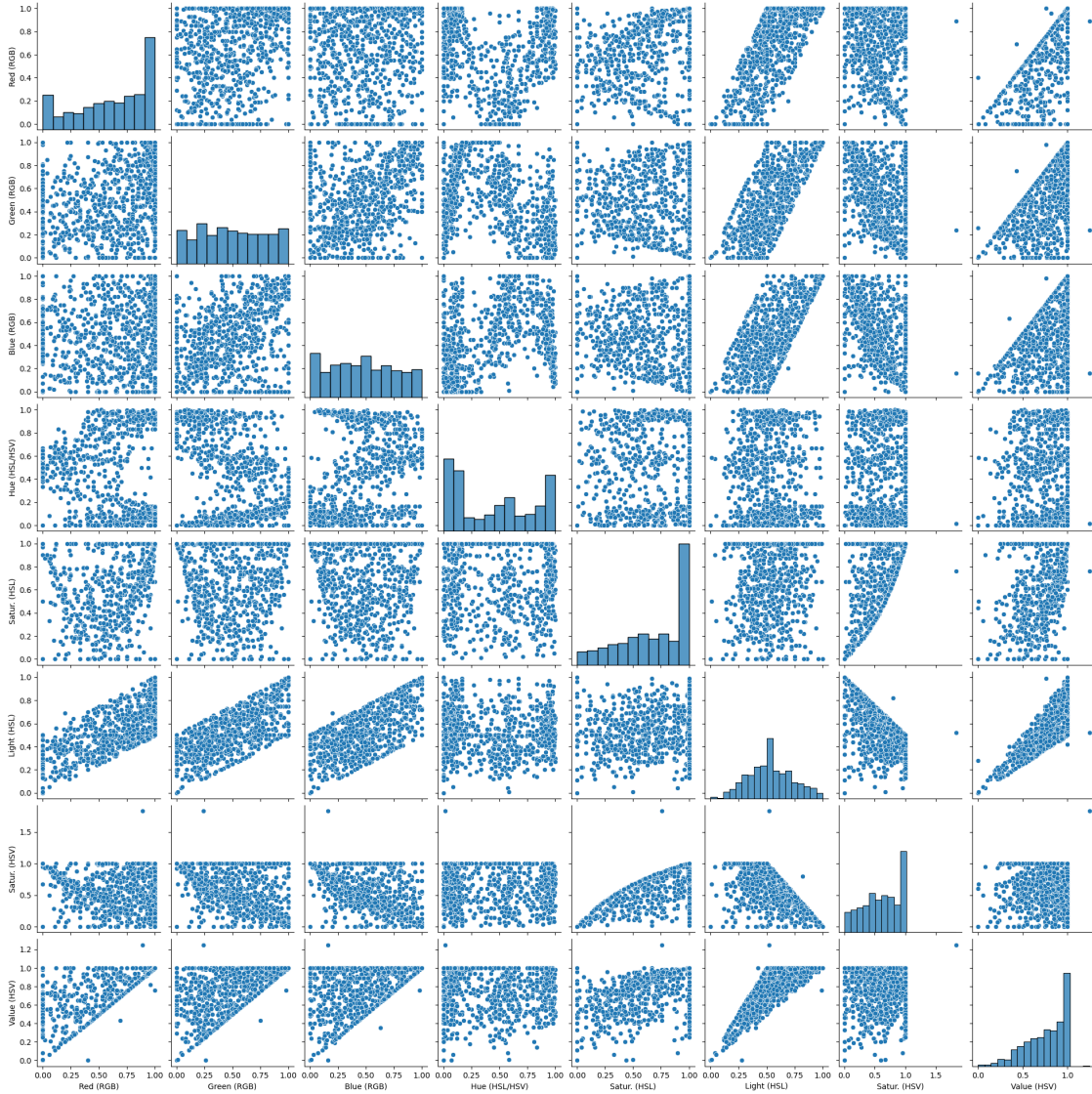
```
sns.heatmap(data=df_colors.corr(), annot=True)
```

```
[6]: <AxesSubplot:>
```



```
[7]: sns.pairplot(df_colors)
```

```
[7]: <seaborn.axisgrid.PairGrid at 0x7f64dbda84c0>
```



Colors are looked up by splitting the query color name by words, then looking for the first exact match with one of the words, but if there are none then it looks for any color with a name containing any of the query words.

For example, consider looking up colors with the word “brown” in their name. Notice that none of the colors are literally “brown” though they all have “brown” in the name.

```
[8]: df_colors.loc[df_colors.Name.str.contains("brown")]
```

```
[8]:
```

	Name	Hex (RGB)	Red (RGB)	Green (RGB)	Blue (RGB)	\
47	bistre brown	#967117	0.59	0.44	0.09	
79	brown sugar	#AF6E4D	0.69	0.43	0.30	
84	burnished brown	#A17A74	0.63	0.48	0.45	
157	coyote brown	#81613C	0.51	0.38	0.24	

168	dark brown	#654321	0.40	0.26	0.13
209	drab dark brown	#4A412A	0.29	0.25	0.16
271	golden brown	#996515	0.60	0.40	0.08
596	pullman brown (ups brown)	#644117	0.39	0.25	0.09
661	rosy brown	#BC8F8F	0.74	0.56	0.56
677	saddle brown	#8B4513	0.55	0.27	0.07
688	sandy brown	#F4A460	0.96	0.64	0.38
701	seal brown	#59260B	0.20	0.08	0.08
765	sweet brown	#A83731	0.66	0.22	0.19
799	tuscan brown	#6F4E37	0.44	0.31	0.22
821	van dyke brown	#664228	0.40	0.26	0.16
860	wood brown	#C19A6B	0.76	0.60	0.42

	Hue (HSL/HSV)	Satur. (HSL)	Light (HSL)	Satur. (HSV)	Value (HSV)	\
47	0.119444	0.73	0.34	0.85	0.59	
79	0.055556	0.39	0.49	0.56	0.69	
84	0.022222	0.19	0.54	0.28	0.63	
157	0.088889	0.37	0.37	0.52	0.51	
168	0.083333	0.51	0.26	0.67	0.40	
209	0.119444	0.28	0.23	0.43	0.29	
271	0.100000	0.76	0.34	0.86	0.60	
596	0.091667	0.63	0.24	0.77	0.39	
661	0.000000	0.25	0.65	0.24	0.74	
677	0.069444	0.76	0.31	0.86	0.55	
688	0.077778	0.87	0.67	0.61	0.96	
701	0.000000	0.43	0.14	0.60	0.20	
765	0.008333	0.55	0.43	0.71	0.66	
799	0.069444	0.34	0.33	0.50	0.44	
821	0.069444	0.44	0.28	0.60	0.00	
860	0.091667	0.41	0.59	0.45	0.76	

	Source
47	ISCC-NBS
79	Crayola
84	Crayola
157	colorcode.is
168	X11/Web
209	Pantone
271	<NA>
596	<NA>
661	<NA>
677	<NA>
688	<NA>
701	<NA>
765	<NA>
799	<NA>
821	<NA>

```
[9]: def colorInfo(color):
    color = color.lower()
    words = [color] if color.count(' ') == 0 else [color] + color.split(' ')
    for word in words:
        try:
            items = df_colors.loc[df_colors.Name == word]
            if len(items) > 0:
                return items
        except:
            continue

    for word in words:
        try:
            items = df_colors.loc[df_colors.Name.str.contains(word)]
            if len(items) > 0:
                return items
        except:
            continue

    return None

# def rgb(color):
#     info = colorInfo(color)
#     if info is None: return (None, None, None)
#     r = info['Red (RGB)'].values[0]
#     g = info['Green (RGB)'].values[0]
#     b = info['Blue (RGB)'].values[0]
#     return (r, g, b)

def rgbhsv(color):
    info = colorInfo(color)
    if info is None: return (None, None, None, None, None, None)
    r = info['Red (RGB)'].values[0]
    g = info['Green (RGB)'].values[0]
    b = info['Blue (RGB)'].values[0]
    h = info['Hue (HSL/HSV)'].values[0]
    s = info['Satur. (HSV)'].values[0]
    v = info['Value (HSV)'].values[0]
    return (r, g, b, h, s, v)

rgbhsv('brown')
```

```
[9]: (0.59, 0.44, 0.09, 0.11944444444444445, 0.85, 0.59)
```



```
[10]: def flatten(x):
      res = []
      for y in x:
          res.extend(y)
      return res

      flatten([(1, 2), ('x', 'y')])
```

```
[10]: [1, 2, 'x', 'y']
```

```
[11]: df_out['Colors (count)'] = df_out.Color.str.count('/') + 1
      df_out = df_out.assign(**{
          'Color 0': [colors[0] for colors in df_out.Color.str.split('/')],
          'Color 1': [colors[1] if len(colors) > 1 else None for colors in df_out.
              ↪Color.str.split('/')])
      }).convert_dtypes(infer_objects=True)
      df_out.info()
      df_out.head()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 149511 entries, 0 to 149510
Data columns (total 15 columns):
#   Column                Non-Null Count  Dtype
---  -
0   Animal ID             149511 non-null string
1   Name                  106260 non-null string
2   DateTime              149511 non-null datetime64[ns]
3   MonthYear             149511 non-null string
4   Date of Birth         149511 non-null datetime64[ns]
5   Outcome Type          149485 non-null string
6   Outcome Subtype       68443 non-null string
7   Animal Type           149511 non-null string
8   Sex upon Outcome      149509 non-null string
9   Age upon Outcome      149465 non-null string
10  Breed                 149511 non-null string
11  Color                 149511 non-null string
12  Colors (count)        149511 non-null Int64
13  Color 0               149511 non-null string
14  Color 1               79869 non-null string
dtypes: Int64(1), datetime64[ns](2), string(12)
memory usage: 17.3 MB
```

```
[11]: Animal ID   Name      DateTime MonthYear Date of Birth Outcome Type \
0   A794011   Chunk  2019-05-08 18:20:00 May 2019   2017-05-02   Rto-Adopt
1   A776359   Gizmo  2018-07-18 16:02:00 Jul 2018   2017-07-12   Adoption
2   A821648   <NA>  2020-08-16 11:38:00 Aug 2020   2019-08-16   Euthanasia
3   A720371   Moose  2016-02-13 17:59:00 Feb 2016   2015-10-08   Adoption
```

```
4   A674754   <NA> 2014-03-18 11:47:00   Mar 2014   2014-03-12   Transfer
```

```
Outcome Subtype Animal Type Sex upon Outcome Age upon Outcome \
0          <NA>      Cat   Neutered Male          2 years
1          <NA>      Dog   Neutered Male          1 year
2          <NA>    Other          Unknown          1 year
3          <NA>      Dog   Neutered Male          4 months
4      Partner      Cat   Intact Male          6 days
```

```
Breed          Color  Colors (count) \
0      Domestic Shorthair Mix  Brown Tabby/White          2
1      Chihuahua Shorthair Mix    White/Brown          2
2          Raccoon          Gray          1
3  Anatol Shepherd/Labrador Retriever    Buff          1
4          Domestic Shorthair Mix    Orange Tabby          1
```

```
Color 0 Color 1
0  Brown Tabby  White
1      White  Brown
2      Gray   <NA>
3      Buff   <NA>
4  Orange Tabby  <NA>
```

This cell takes a few minutes to complete

```
[12]: color_vars = 'RGBHSV'

for color_index in ['0', '1']:
    colors = df_out[f'Color {color_index}']
    colors_isna = colors.isna()
    colors_RGBHSV = [rgbhsv(color) if not colors_isna[i] else (None, None, None,
↪None, None, None, None) for i,color in enumerate(colors)]
    color_columns = []
    for color_var_i in range(len(color_vars)):
        color_var = color_vars[color_var_i]
        color_column = f'Color {color_index} {color_var}'
        color_columns.append(color_column)
        df_out = df_out.assign(**{
            color_column: pd.Series(np.zeros_like(df_out.index)).
↪astype(dtype=float)
        })
    df_out[color_columns] = colors_RGBHSV

df_out
```

```
[12]: Animal ID      Name      DateTime MonthYear Date of Birth \
0      A794011      Chunk 2019-05-08 18:20:00   May 2019   2017-05-02
```

1	A776359	Gizmo	2018-07-18	16:02:00	Jul 2018	2017-07-12
2	A821648	<NA>	2020-08-16	11:38:00	Aug 2020	2019-08-16
3	A720371	Moose	2016-02-13	17:59:00	Feb 2016	2015-10-08
4	A674754	<NA>	2014-03-18	11:47:00	Mar 2014	2014-03-12
...
149506	A859974	*Lady Gaga	2022-08-16	11:42:00	Aug 2022	2012-06-21
149507	A856973	*Suede	2022-06-11	15:39:00	Jun 2022	2021-05-10
149508	A852036	Queen	2022-03-17	17:22:00	Mar 2022	2021-12-08
149509	A852775	A852775	2022-05-18	14:13:00	May 2022	2022-01-31
149510	A854626	A854626	2022-05-03	16:10:00	May 2022	2022-02-27

	Outcome Type	Outcome Subtype	Animal Type	Sex upon Outcome	\
0	Rto-Adopt	<NA>	Cat	Neutered Male	
1	Adoption	<NA>	Dog	Neutered Male	
2	Euthanasia	<NA>	Other	Unknown	
3	Adoption	<NA>	Dog	Neutered Male	
4	Transfer	Partner	Cat	Intact Male	
...	
149506	Adoption	<NA>	Cat	Spayed Female	
149507	Adoption	<NA>	Cat	Spayed Female	
149508	Adoption	<NA>	Dog	Spayed Female	
149509	Adoption	Foster	Cat	Spayed Female	
149510	Adoption	Foster	Cat	Neutered Male	

	Age upon Outcome	...	Color 0 B	Color 0 H	Color 0 S	Color 0 V	\
0	2 years	...	0.09	0.119444	0.85	0.59	
1	1 year	...	1.00	0.000000	0.00	1.00	
2	1 year	...	0.71	0.375000	0.06	0.75	
3	4 months	...	0.50	0.091667	0.50	1.00	
4	6 days	...	0.00	0.083333	1.00	1.00	
...	
149506	10 years	...	1.00	0.000000	0.00	1.00	
149507	1 year	...	1.00	0.666667	1.00	1.00	
149508	3 months	...	0.09	0.119444	0.85	0.59	
149509	3 months	...	NaN	NaN	NaN	NaN	
149510	2 months	...	0.00	0.083333	1.00	1.00	

	Color 1 R	Color 1 G	Color 1 B	Color 1 H	Color 1 S	Color 1 V
0	1.00	1.00	1.00	0.000000	0.00	1.00
1	0.59	0.44	0.09	0.119444	0.85	0.59
2	NaN	NaN	NaN	NaN	NaN	NaN
3	NaN	NaN	NaN	NaN	NaN	NaN
4	NaN	NaN	NaN	NaN	NaN	NaN
...
149506	NaN	NaN	NaN	NaN	NaN	NaN
149507	NaN	NaN	NaN	NaN	NaN	NaN
149508	0.00	0.00	0.00	0.000000	0.00	0.00

149509	NaN	NaN	NaN	NaN	NaN	NaN
149510	NaN	NaN	NaN	NaN	NaN	NaN

[149511 rows x 27 columns]

1.2 Age

The “Age upon Outcome (years)” column is made here

```
[13]: def age_years(age):
    try:
        [number_str, unit] = age.split(' ')
        number = float(number_str)
        if unit in ['years', 'year']:
            return number
        elif unit in ['months', 'month']:
            return number / 12
        elif unit in ['weeks', 'week']:
            return number / 52
        elif unit in ['days', 'day']:
            return number / 365
    except: pass
    return None

df_out['Age upon Outcome (years)'] = [age_years(age) for age in df_out['Age_
upon Outcome']]
df_out.head()
```

```
[13]: Animal ID    Name    DateTime MonthYear Date of Birth Outcome Type \
0    A794011    Chunk    2019-05-08 18:20:00 May 2019    2017-05-02    Rto-Adopt
1    A776359    Gizmo    2018-07-18 16:02:00 Jul 2018    2017-07-12    Adoption
2    A821648    <NA>    2020-08-16 11:38:00 Aug 2020    2019-08-16    Euthanasia
3    A720371    Moose    2016-02-13 17:59:00 Feb 2016    2015-10-08    Adoption
4    A674754    <NA>    2014-03-18 11:47:00 Mar 2014    2014-03-12    Transfer
```

	Outcome Subtype	Animal Type	Sex upon Outcome	Age upon Outcome	...	\
0	<NA>	Cat	Neutered Male	2 years	...	
1	<NA>	Dog	Neutered Male	1 year	...	
2	<NA>	Other	Unknown	1 year	...	
3	<NA>	Dog	Neutered Male	4 months	...	
4	Partner	Cat	Intact Male	6 days	...	

	Color 0 H	Color 0 S	Color 0 V	Color 1 R	Color 1 G	Color 1 B	Color 1 H	\
0	0.119444	0.85	0.59	1.00	1.00	1.00	0.000000	
1	0.000000	0.00	1.00	0.59	0.44	0.09	0.119444	
2	0.375000	0.06	0.75	NaN	NaN	NaN	NaN	
3	0.091667	0.50	1.00	NaN	NaN	NaN	NaN	

```
4  0.083333      1.00      1.00      NaN      NaN      NaN      NaN
```

```
      Color 1 S  Color 1 V  Age upon Outcome (years)
0          0.00      1.00          2.000000
1          0.85      0.59          1.000000
2          NaN      NaN          1.000000
3          NaN      NaN          0.333333
4          NaN      NaN          0.016438
```

```
[5 rows x 28 columns]
```

1.3 Sex

Male or female are classified in two columns since some animals are of unknown sex

```
[14]: # sex and neuter/spay columns

sex_male = df_out['Sex upon Outcome'].str.endswith(' Male')
sex_female = df_out['Sex upon Outcome'].str.endswith(' Female')
neutered_or_spayed = df_out['Sex upon Outcome'].str.startswith('Neutered') | \
    df_out['Sex upon Outcome'].str.startswith('Spayed')

df_out['Male'] = sex_male
df_out['Female'] = sex_female
df_out['NeuteredOrSpayed'] = neutered_or_spayed
df_out = df_out.convert_dtypes(convert_boolean=True)
df_out.info()
df_out.head(10)
```

```
<class 'pandas.core.frame.DataFrame'>
```

```
RangeIndex: 149511 entries, 0 to 149510
```

```
Data columns (total 31 columns):
```

#	Column	Non-Null Count	Dtype
0	Animal ID	149511 non-null	string
1	Name	106260 non-null	string
2	DateTime	149511 non-null	datetime64[ns]
3	MonthYear	149511 non-null	string
4	Date of Birth	149511 non-null	datetime64[ns]
5	Outcome Type	149485 non-null	string
6	Outcome Subtype	68443 non-null	string
7	Animal Type	149511 non-null	string
8	Sex upon Outcome	149509 non-null	string
9	Age upon Outcome	149465 non-null	string
10	Breed	149511 non-null	string
11	Color	149511 non-null	string
12	Colors (count)	149511 non-null	Int64
13	Color 0	149511 non-null	string

```

14 Color 1 79869 non-null string
15 Color 0 R 135638 non-null Float64
16 Color 0 G 135638 non-null Float64
17 Color 0 B 135638 non-null Float64
18 Color 0 H 135638 non-null Float64
19 Color 0 S 135638 non-null Float64
20 Color 0 V 135638 non-null Float64
21 Color 1 R 78596 non-null Float64
22 Color 1 G 78596 non-null Float64
23 Color 1 B 78596 non-null Float64
24 Color 1 H 78596 non-null Float64
25 Color 1 S 78596 non-null Float64
26 Color 1 V 78596 non-null Float64
27 Age upon Outcome (years) 149465 non-null Float64
28 Male 149509 non-null boolean
29 Female 149509 non-null boolean
30 NeuteredOrSpayed 149509 non-null boolean
dtypes: Float64(13), Int64(1), boolean(3), datetime64[ns](2), string(12)
memory usage: 34.8 MB

```

```

[14]: Animal ID      Name      DateTime MonthYear Date of Birth \
0 A794011      Chunk 2019-05-08 18:20:00 May 2019 2017-05-02
1 A776359      Gizmo 2018-07-18 16:02:00 Jul 2018 2017-07-12
2 A821648      <NA> 2020-08-16 11:38:00 Aug 2020 2019-08-16
3 A720371      Moose 2016-02-13 17:59:00 Feb 2016 2015-10-08
4 A674754      <NA> 2014-03-18 11:47:00 Mar 2014 2014-03-12
5 A659412      Princess 2020-10-05 14:37:00 Oct 2020 2013-03-24
6 A814515      Quentin 2020-05-06 07:59:00 May 2020 2018-03-01
7 A868405      *Leo 2023-03-04 13:38:00 Mar 2023 2020-11-02
8 A689724      *Donatello 2014-10-18 18:52:00 Oct 2014 2014-08-01
9 A680969      *Zeus 2014-08-05 16:59:00 Aug 2014 2014-06-03

```

```

Outcome Type Outcome Subtype Animal Type Sex upon Outcome Age upon Outcome \
0 Rto-Adopt <NA> Cat Neutered Male 2 years
1 Adoption <NA> Dog Neutered Male 1 year
2 Euthanasia <NA> Other Unknown 1 year
3 Adoption <NA> Dog Neutered Male 4 months
4 Transfer Partner Cat Intact Male 6 days
5 Adoption <NA> Dog Spayed Female 7 years
6 Adoption Foster Dog Neutered Male 2 years
7 Adoption <NA> Dog Neutered Male 2 years
8 Adoption <NA> Cat Neutered Male 2 months
9 Adoption <NA> Cat Neutered Male 2 months

```

```

... Color 1 R Color 1 G Color 1 B Color 1 H Color 1 S Color 1 V \
0 ... 1.0 1.0 1.0 0.0 0.0 1.0
1 ... 0.59 0.44 0.09 0.119444 0.85 0.59

```

2	...	<NA>	<NA>	<NA>	<NA>	<NA>	<NA>
3	...	<NA>	<NA>	<NA>	<NA>	<NA>	<NA>
4	...	<NA>	<NA>	<NA>	<NA>	<NA>	<NA>
5	...	<NA>	<NA>	<NA>	<NA>	<NA>	<NA>
6	...	0.59	0.44	0.09	0.119444	0.85	0.59
7	...	1.0	1.0	1.0	0.0	0.0	1.0
8	...	<NA>	<NA>	<NA>	<NA>	<NA>	<NA>
9	...	1.0	0.5	0.0	0.083333	1.0	1.0

	Age upon Outcome (years)	Male	Female	NeuteredOrSpayed
0	2.0	True	False	True
1	1.0	True	False	True
2	1.0	False	False	False
3	0.333333	True	False	True
4	0.016438	True	False	False
5	7.0	False	True	True
6	2.0	True	False	True
7	2.0	True	False	True
8	0.166667	True	False	True
9	0.166667	True	False	True

[10 rows x 31 columns]

1.4 Adopted?

```
[15]: df_out['Adopted'] = df_out['Outcome Type'].str.find('Adopt') >= 0
```

```
[16]: def bigCorr_bernoulli(df, independent, dependent):
    return (
        df[[independent, dependent]].groupby(independent).value_counts().div(
            df[[independent]].groupby(independent).value_counts()
        )[:, True]
```

2 Analysis by breed

2.1 Preparing the breeds dataframe

```
[17]: breeds_counts = df_out.Breed.value_counts()
df_breeds = pd.DataFrame(index=breeds_counts.index)
df_breeds = df_breeds.assign(Breed=breeds_counts.index, Count=breeds_counts)
df_breeds
```

```
[17]:
Domestic Shorthair Mix      Breed \
Domestic Shorthair         Domestic Shorthair Mix
Pit Bull Mix                Domestic Shorthair
                             Pit Bull Mix
```

Labrador Retriever Mix	Labrador Retriever Mix
Chihuahua Shorthair Mix	Chihuahua Shorthair Mix
...	...
Lovebird Mix	Lovebird Mix
American Pit Bull Terrier/Pointer	American Pit Bull Terrier/Pointer
Dachshund Wirehair/Manchester Terrier	Dachshund Wirehair/Manchester Terrier
Norfolk Terrier/Border Terrier	Norfolk Terrier/Border Terrier
Pointer/English Coonhound	Pointer/English Coonhound

	Count
Domestic Shorthair Mix	33260
Domestic Shorthair	13808
Pit Bull Mix	9406
Labrador Retriever Mix	7913
Chihuahua Shorthair Mix	6689
...	...
Lovebird Mix	1
American Pit Bull Terrier/Pointer	1
Dachshund Wirehair/Manchester Terrier	1
Norfolk Terrier/Border Terrier	1
Pointer/English Coonhound	1

[2833 rows x 2 columns]

```
[18]: # Add animal type to the breed
breeds_types = df_out[['Breed', 'Animal Type']].groupby('Breed').value_counts().
    ↪index
breeds = [breed_type[0] for breed_type in breeds_types]
types = [breed_type[1] for breed_type in breeds_types]
df_breeds_types = pd.DataFrame(data=types, index=breeds, columns=['Type'])
df_breeds_types = df_breeds_types.assign(Breed=breeds)
df_breeds_types = df_breeds_types.drop_duplicates('Breed')
df_breeds = df_breeds_types.drop_duplicates('Breed')
df_breeds = df_breeds.assign(**{'Animal Type': df_breeds_types['Type']})
df_breeds = df_breeds.convert_dtypes(infer_objects=True)
df_breeds
```

	Breed \
Domestic Shorthair Mix	Domestic Shorthair Mix
Domestic Shorthair	Domestic Shorthair
Pit Bull Mix	Pit Bull Mix
Labrador Retriever Mix	Labrador Retriever Mix
Chihuahua Shorthair Mix	Chihuahua Shorthair Mix
...	...
Lovebird Mix	Lovebird Mix
American Pit Bull Terrier/Pointer	American Pit Bull Terrier/Pointer
Dachshund Wirehair/Manchester Terrier	Dachshund Wirehair/Manchester Terrier
Norfolk Terrier/Border Terrier	Norfolk Terrier/Border Terrier

Pointer/English Coonhound

Pointer/English Coonhound

	Count	Animal Type
Domestic Shorthair Mix	33260	Cat
Domestic Shorthair	13808	Cat
Pit Bull Mix	9406	Dog
Labrador Retriever Mix	7913	Dog
Chihuahua Shorthair Mix	6689	Dog
...
Lovebird Mix	1	Bird
American Pit Bull Terrier/Pointer	1	Dog
Dachshund Wirehair/Manchester Terrier	1	Dog
Norfolk Terrier/Border Terrier	1	Dog
Pointer/English Coonhound	1	Dog

[2833 rows x 3 columns]

```
[19]: ## Adoption likelihood
```

```
df_breeds = df_breeds.assign(Adopted=bigCorr_bernoulli(df_out, 'Breed',  
↳ 'Adopted'))  
df_breeds
```

```
[19]:
```

	Breed \
Domestic Shorthair Mix	Domestic Shorthair Mix
Domestic Shorthair	Domestic Shorthair
Pit Bull Mix	Pit Bull Mix
Labrador Retriever Mix	Labrador Retriever Mix
Chihuahua Shorthair Mix	Chihuahua Shorthair Mix
...	...
Lovebird Mix	Lovebird Mix
American Pit Bull Terrier/Pointer	American Pit Bull Terrier/Pointer
Dachshund Wirehair/Manchester Terrier	Dachshund Wirehair/Manchester Terrier
Norfolk Terrier/Border Terrier	Norfolk Terrier/Border Terrier
Pointer/English Coonhound	Pointer/English Coonhound

	Count	Animal Type	Adopted
Domestic Shorthair Mix	33260	Cat	0.461425
Domestic Shorthair	13808	Cat	0.553158
Pit Bull Mix	9406	Dog	0.431427
Labrador Retriever Mix	7913	Dog	0.546063
Chihuahua Shorthair Mix	6689	Dog	0.483181
...
Lovebird Mix	1	Bird	1.000000
American Pit Bull Terrier/Pointer	1	Dog	1.000000
Dachshund Wirehair/Manchester Terrier	1	Dog	1.000000
Norfolk Terrier/Border Terrier	1	Dog	NaN

Pointer/English Coonhound

1

Dog 1.000000

[2833 rows x 4 columns]

```
[20]: def means(df_groups, df_individual, independent, dependent):
        df_groups[f'{dependent} (mean)'] = df_individual[[independent, dependent]].
        ↳groupby(independent).mean()
    def stdDevs(df_groups, df_individual, independent, dependent):
        df_groups[f'{dependent} (std dev)'] = df_individual[[independent,
        ↳dependent]].groupby(independent).std()
    def stats(df_groups, df_individual, independent, dependent):
        means(df_groups, df_individual, independent, dependent)
        stdDevs(df_groups, df_individual, independent, dependent)

    for color_index in ['0', '1']:
        for color_feature in color_vars:
            stats(df_breeds, df_out, 'Breed', f'Color {color_index}
            ↳{color_feature}')

df_breeds.head()
```

```
[20]:
```

	Breed	Count	Animal Type	Adopted \
Domestic Shorthair Mix	Domestic Shorthair Mix	33260	Cat	0.461425
Domestic Shorthair	Domestic Shorthair	13808	Cat	0.553158
Pit Bull Mix	Pit Bull Mix	9406	Dog	0.431427
Labrador Retriever Mix	Labrador Retriever Mix	7913	Dog	0.546063
Chihuahua Shorthair Mix	Chihuahua Shorthair Mix	6689	Dog	0.483181

	Color 0 R (mean)	Color 0 R (std dev)	\
Domestic Shorthair Mix	0.439476	0.412274	
Domestic Shorthair	0.451115	0.412934	
Pit Bull Mix	0.513666	0.403283	
Labrador Retriever Mix	0.409771	0.421755	
Chihuahua Shorthair Mix	0.609789	0.370759	

	Color 0 G (mean)	Color 0 G (std dev)	\
Domestic Shorthair Mix	0.322711	0.323957	
Domestic Shorthair	0.331264	0.324532	
Pit Bull Mix	0.418784	0.381554	
Labrador Retriever Mix	0.329495	0.388036	
Chihuahua Shorthair Mix	0.493648	0.361854	

	Color 0 B (mean)	Color 0 B (std dev)	... \
Domestic Shorthair Mix	0.286948	0.413041	...
Domestic Shorthair	0.293482	0.413847	...
Pit Bull Mix	0.476534	0.439715	...
Labrador Retriever Mix	0.181561	0.323025	...

Chihuahua Shorthair Mix	0.356013	0.369441	...
	Color 1 G (mean)	Color 1 G (std dev)	\
Domestic Shorthair Mix	0.877082	0.302012	
Domestic Shorthair	0.86943	0.310584	
Pit Bull Mix	0.842194	0.318559	
Labrador Retriever Mix	0.858574	0.298292	
Chihuahua Shorthair Mix	0.737161	0.330531	
	Color 1 B (mean)	Color 1 B (std dev)	\
Domestic Shorthair Mix	0.879391	0.315389	
Domestic Shorthair	0.869237	0.327447	
Pit Bull Mix	0.830459	0.350301	
Labrador Retriever Mix	0.82045	0.350653	
Chihuahua Shorthair Mix	0.64574	0.398973	
	Color 1 H (mean)	Color 1 H (std dev)	\
Domestic Shorthair Mix	0.028722	0.115326	
Domestic Shorthair	0.027946	0.112799	
Pit Bull Mix	0.034014	0.115363	
Labrador Retriever Mix	0.018031	0.055216	
Chihuahua Shorthair Mix	0.038664	0.059027	
	Color 1 S (mean)	Color 1 S (std dev)	\
Domestic Shorthair Mix	0.080351	0.259559	
Domestic Shorthair	0.08027	0.259781	
Pit Bull Mix	0.124423	0.298265	
Labrador Retriever Mix	0.097087	0.249907	
Chihuahua Shorthair Mix	0.221868	0.320446	
	Color 1 V (mean)	Color 1 V (std dev)	
Domestic Shorthair Mix	0.919515	0.250093	
Domestic Shorthair	0.910416	0.263834	
Pit Bull Mix	0.893498	0.257412	
Labrador Retriever Mix	0.885889	0.270776	
Chihuahua Shorthair Mix	0.797511	0.301396	

[5 rows x 28 columns]

```
[21]: # sns.pairplot(data=df_breeds)
```

```
[22]: df_breeds_info = pd.read_csv('dog_breeds_enriched_20210503.csv').
      ↪convert_dtypes(infer_objects=True)
df_breeds_info.info()
df_breeds_info.head()
```

```
<class 'pandas.core.frame.DataFrame'>
```

RangeIndex: 195 entries, 0 to 194

Data columns (total 14 columns):

#	Column	Non-Null Count	Dtype
0	Breed	195 non-null	string
1	Breed Group AKC	195 non-null	string
2	Breed Group CKC	195 non-null	string
3	Breed Group UKC	195 non-null	string
4	CKC Subgroup	194 non-null	string
5	height_low_inches	195 non-null	Float64
6	height_high_inches	195 non-null	Float64
7	average height	195 non-null	Float64
8	weight_low_lbs	195 non-null	Float64
9	weight_high_lbs	195 non-null	Int64
10	average weight	195 non-null	Float64
11	Lifespan Low	194 non-null	Int64
12	Lifespan High	194 non-null	Int64
13	average lifespan	195 non-null	Float64

dtypes: Float64(6), Int64(3), string(5)

memory usage: 23.2 KB

```
[22]:      Breed Breed Group AKC \
0      Affenpinscher      Toy Group
1      Afghan Hound      Hound Group
2      Aidi      Not Recognized
3      Airedale Terrier      Terrier Group
4      Akbash Dog      Not Recognized

      Breed Group CKC      Breed Group UKC \
0      Group 5: Pinschers and Schnauzers      Companion Dog
1      Group 8: Sighthound Breeds      Sighthound & Pariah
2      Not Recognized      Guardian Dog
3      Group 6: Terrier Breeds      Terrier
4      Group 9: Large Guardian Pastoral/Mountain Dogs      Guardian Dog

      CKC Subgroup      height_low_inches \
0      5-B: Small Pinschers and Schnauzers      9.0
1      8-B: Long Haired Sighthounds      25.0
2      Not Recognized      20.0
3      6-A: Large Terriers      22.0
4      None      27.0

      height_high_inches      average height      weight_low_lbs      weight_high_lbs \
0      12.0      10.5      8.0      12
1      27.0      26.0      50.0      60
2      24.5      22.25      50.0      55
3      24.0      23.0      45.0      45
```

4	34.0	30.5	75.0	140
	average weight	Lifespan Low	Lifespan High	average lifespan
0	10.0	12	15	13.5
1	55.0	12	15	13.5
2	52.5	12	13	12.5
3	45.0	11	14	12.5
4	107.5	9	11	10.0

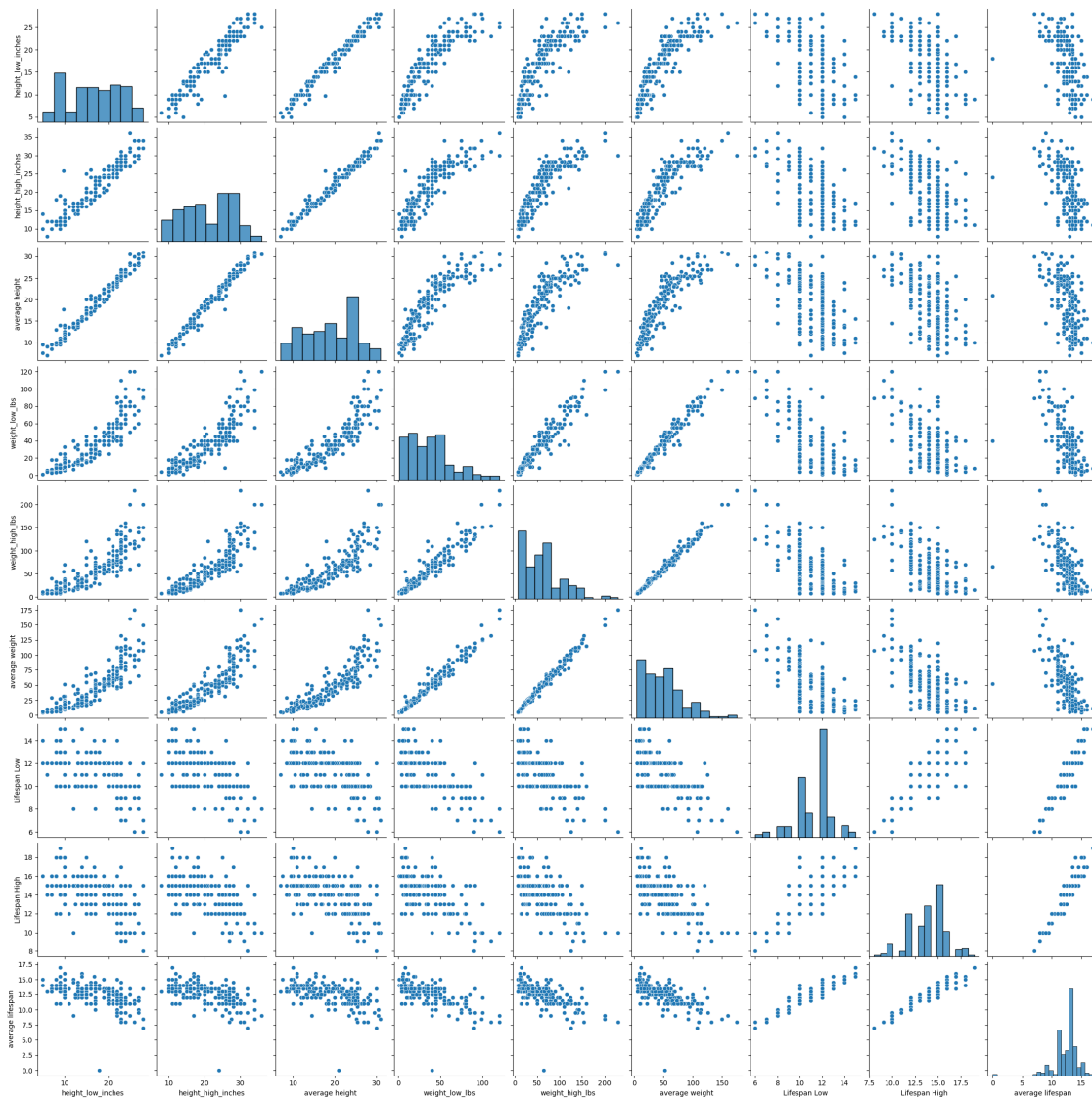
```
[23]: sns.pairplot(data=df_breeds_info)
```

```
/home/isaac/miniconda3/envs/cse3380/lib/python3.10/site-
packages/seaborn/distributions.py:499: FutureWarning: In a future version, the
Index constructor will not infer numeric dtypes when passed object-dtype
sequences (matching Series behavior)
  pd.Index(edges, name="edges"),
/home/isaac/miniconda3/envs/cse3380/lib/python3.10/site-
packages/seaborn/distributions.py:500: FutureWarning: In a future version, the
Index constructor will not infer numeric dtypes when passed object-dtype
sequences (matching Series behavior)
  pd.Index(widths, name="widths"),
/home/isaac/miniconda3/envs/cse3380/lib/python3.10/site-
packages/seaborn/distributions.py:499: FutureWarning: In a future version, the
Index constructor will not infer numeric dtypes when passed object-dtype
sequences (matching Series behavior)
  pd.Index(edges, name="edges"),
/home/isaac/miniconda3/envs/cse3380/lib/python3.10/site-
packages/seaborn/distributions.py:500: FutureWarning: In a future version, the
Index constructor will not infer numeric dtypes when passed object-dtype
sequences (matching Series behavior)
  pd.Index(widths, name="widths"),
/home/isaac/miniconda3/envs/cse3380/lib/python3.10/site-
packages/seaborn/distributions.py:499: FutureWarning: In a future version, the
Index constructor will not infer numeric dtypes when passed object-dtype
sequences (matching Series behavior)
  pd.Index(edges, name="edges"),
/home/isaac/miniconda3/envs/cse3380/lib/python3.10/site-
packages/seaborn/distributions.py:500: FutureWarning: In a future version, the
Index constructor will not infer numeric dtypes when passed object-dtype
sequences (matching Series behavior)
  pd.Index(widths, name="widths"),
/home/isaac/miniconda3/envs/cse3380/lib/python3.10/site-
packages/seaborn/distributions.py:499: FutureWarning: In a future version, the
Index constructor will not infer numeric dtypes when passed object-dtype
sequences (matching Series behavior)
  pd.Index(edges, name="edges"),
/home/isaac/miniconda3/envs/cse3380/lib/python3.10/site-
```



```
pd.Index(edges, name="edges"),
/home/isaac/miniconda3/envs/cse3380/lib/python3.10/site-
packages/seaborn/distributions.py:500: FutureWarning: In a future version, the
Index constructor will not infer numeric dtypes when passed object-dtype
sequences (matching Series behavior)
pd.Index(widths, name="widths"),
```

[23]: <seaborn.axisgrid.PairGrid at 0x7f64d160c610>



```
[24]: breeds_names_lower = df_breeds_info.Breed.str.lower()
```

```
def findBreedInfoName(breed):
    breed = breed.lower()
```

```

info = df_breeds_info.Breed.loc[breeds_names_lower.str.contains(breed)]
if len(info) > 0: return info.values[0]

for word in breed.split(' '):
    info = df_breeds_info.Breed.loc[breeds_names_lower.str.contains(word)]
    if len(info) > 0: return info.values[0]

return None

```

```

[25]: df_out_with_breeds_info = df_out.
      ↪assign(BreedsInfoName=[findBreedInfoName(breed) for breed in df_out.Breed])
df_out_with_breeds_info = df_out_with_breeds_info.merge(df_breeds_info,
      ↪how='left', left_on='BreedsInfoName', right_on='Breed')
df_out_with_breeds_info.rename(columns={'Breed_x': 'Breed', 'Breed_y': 'Breed_
      ↪(catalog)'}, inplace=True)
df_out_with_breeds_info.info()
df_out_with_breeds_info.head()

```

```
<class 'pandas.core.frame.DataFrame'>
```

```
Int64Index: 149511 entries, 0 to 149510
```

```
Data columns (total 47 columns):
```

#	Column	Non-Null Count	Dtype
0	Animal ID	149511 non-null	string
1	Name	106260 non-null	string
2	DateTime	149511 non-null	datetime64[ns]
3	MonthYear	149511 non-null	string
4	Date of Birth	149511 non-null	datetime64[ns]
5	Outcome Type	149485 non-null	string
6	Outcome Subtype	68443 non-null	string
7	Animal Type	149511 non-null	string
8	Sex upon Outcome	149509 non-null	string
9	Age upon Outcome	149465 non-null	string
10	Breed	149511 non-null	string
11	Color	149511 non-null	string
12	Colors (count)	149511 non-null	Int64
13	Color 0	149511 non-null	string
14	Color 1	79869 non-null	string
15	Color 0 R	135638 non-null	Float64
16	Color 0 G	135638 non-null	Float64
17	Color 0 B	135638 non-null	Float64
18	Color 0 H	135638 non-null	Float64
19	Color 0 S	135638 non-null	Float64
20	Color 0 V	135638 non-null	Float64
21	Color 1 R	78596 non-null	Float64
22	Color 1 G	78596 non-null	Float64


```

23 Color 1 B          78596 non-null   Float64
24 Color 1 H          78596 non-null   Float64
25 Color 1 S          78596 non-null   Float64
26 Color 1 V          78596 non-null   Float64
27 Age upon Outcome (years) 149465 non-null   Float64
28 Male               149509 non-null   boolean
29 Female             149509 non-null   boolean
30 NeuteredOrSpayed   149509 non-null   boolean
31 Adopted            149485 non-null   boolean
32 BreedsInfoName     138419 non-null   object
33 Breed (catalog)    138419 non-null   string
34 Breed Group AKC    138419 non-null   string
35 Breed Group CKC    138419 non-null   string
36 Breed Group UKC    138419 non-null   string
37 CKC Subgroup       138414 non-null   string
38 height_low_inches  138419 non-null   Float64
39 height_high_inches 138419 non-null   Float64
40 average height     138419 non-null   Float64
41 weight_low_lbs     138419 non-null   Float64
42 weight_high_lbs    138419 non-null   Int64
43 average weight     138419 non-null   Float64
44 Lifespan Low       138415 non-null   Int64
45 Lifespan High      138415 non-null   Int64
46 average lifespan   138419 non-null   Float64
dtypes: Float64(19), Int64(4), boolean(4), datetime64[ns](2), object(1),
string(17)
memory usage: 54.6+ MB

```

```

[25]: Animal ID      Name      DateTime MonthYear Date of Birth Outcome Type \
0      A794011      Chunk 2019-05-08 18:20:00 May 2019      2017-05-02      Rto-Adopt
1      A776359      Gizmo 2018-07-18 16:02:00 Jul 2018      2017-07-12      Adoption
2      A821648      <NA> 2020-08-16 11:38:00 Aug 2020      2019-08-16      Euthanasia
3      A720371      Moose 2016-02-13 17:59:00 Feb 2016      2015-10-08      Adoption
4      A674754      <NA> 2014-03-18 11:47:00 Mar 2014      2014-03-12      Transfer

```

```

Outcome Subtype Animal Type Sex upon Outcome Age upon Outcome ... \
0      <NA>      Cat      Neutered Male      2 years ...
1      <NA>      Dog      Neutered Male      1 year ...
2      <NA>      Other      Unknown      1 year ...
3      <NA>      Dog      Neutered Male      4 months ...
4      Partner      Cat      Intact Male      6 days ...

```

```

                                CKC Subgroup height_low_inches \
0                                11-A: Pointing Dogs      21.0
1                                12-A: Americas and Caribbean Breeds      5.0
2                                <NA>      <NA>
3      9-A: 9-A Large Mountain/Pastoral Dogs Shepherd...      27.0

```

	height_high_inches	average height	height	weight_low_lbs	weight_high_lbs	\
0	26.0		23.5	45.0	70	
1	10.0		7.5	1.0	7	
2	<NA>		<NA>	<NA>	<NA>	
3	29.0		28.0	100.0	150	
4	26.0		23.5	45.0	70	

	average weight	Lifespan Low	Lifespan High	average lifespan
0	57.5	10	12	11.0
1	4.0	14	16	15.0
2	<NA>	<NA>	<NA>	<NA>
3	125.0	11	13	12.0
4	57.5	10	12	11.0

[5 rows x 47 columns]

```
[26]: df_breeds_with_info = df_breeds.assign(BreedsInfoName=[findBreedInfoName(breed)
    ↪for breed in df_breeds.Breed])
df_breeds_with_info = df_breeds_with_info.merge(df_breeds_info, how='left',
    ↪left_on='BreedsInfoName', right_on='Breed')
df_breeds_with_info.rename(columns={'Breed_x': 'Breed', 'Breed_y': 'Breed',
    ↪(catalog)'}), inplace=True)
df_breeds_with_info.info()
df_breeds_with_info.head()
```

```
<class 'pandas.core.frame.DataFrame'>
```

```
Int64Index: 2833 entries, 0 to 2832
```

```
Data columns (total 43 columns):
```

#	Column	Non-Null Count	Dtype
0	Breed	2833 non-null	string
1	Count	2833 non-null	Int64
2	Animal Type	2833 non-null	string
3	Adopted	2088 non-null	float64
4	Color 0 R (mean)	2721 non-null	Float64
5	Color 0 R (std dev)	1698 non-null	float64
6	Color 0 G (mean)	2721 non-null	Float64
7	Color 0 G (std dev)	1698 non-null	float64
8	Color 0 B (mean)	2721 non-null	Float64
9	Color 0 B (std dev)	1698 non-null	float64
10	Color 0 H (mean)	2721 non-null	Float64
11	Color 0 H (std dev)	1698 non-null	float64
12	Color 0 S (mean)	2721 non-null	Float64
13	Color 0 S (std dev)	1698 non-null	float64
14	Color 0 V (mean)	2721 non-null	Float64

```

15 Color 0 V (std dev) 1698 non-null float64
16 Color 1 R (mean) 2270 non-null Float64
17 Color 1 R (std dev) 1382 non-null float64
18 Color 1 G (mean) 2270 non-null Float64
19 Color 1 G (std dev) 1382 non-null float64
20 Color 1 B (mean) 2270 non-null Float64
21 Color 1 B (std dev) 1382 non-null float64
22 Color 1 H (mean) 2270 non-null Float64
23 Color 1 H (std dev) 1382 non-null float64
24 Color 1 S (mean) 2270 non-null Float64
25 Color 1 S (std dev) 1382 non-null float64
26 Color 1 V (mean) 2270 non-null Float64
27 Color 1 V (std dev) 1382 non-null float64
28 BreedsInfoName 2425 non-null object
29 Breed (catalog) 2425 non-null string
30 Breed Group AKC 2425 non-null string
31 Breed Group CKC 2425 non-null string
32 Breed Group UKC 2425 non-null string
33 CKC Subgroup 2424 non-null string
34 height_low_inches 2425 non-null Float64
35 height_high_inches 2425 non-null Float64
36 average height 2425 non-null Float64
37 weight_low_lbs 2425 non-null Float64
38 weight_high_lbs 2425 non-null Int64
39 average weight 2425 non-null Float64
40 Lifespan Low 2424 non-null Int64
41 Lifespan High 2424 non-null Int64
42 average lifespan 2425 non-null Float64
dtypes: Float64(18), Int64(4), float64(13), object(1), string(7)
memory usage: 1.0+ MB

```

```

[26]:
      Breed  Count Animal Type  Adopted  Color 0 R (mean) \
0  Domestic Shorthair Mix  33260      Cat  0.461425      0.439476
1      Domestic Shorthair  13808      Cat  0.553158      0.451115
2      Pit Bull Mix      9406      Dog  0.431427      0.513666
3  Labrador Retriever Mix   7913      Dog  0.546063      0.409771
4  Chihuahua Shorthair Mix   6689      Dog  0.483181      0.609789

      Color 0 R (std dev)  Color 0 G (mean)  Color 0 G (std dev) \
0      0.412274      0.322711      0.323957
1      0.412934      0.331264      0.324532
2      0.403283      0.418784      0.381554
3      0.421755      0.329495      0.388036
4      0.370759      0.493648      0.361854

      Color 0 B (mean)  Color 0 B (std dev)  ... \
0      0.286948      0.413041  ...

```

1	0.293482	0.413847	...
2	0.476534	0.439715	...
3	0.181561	0.323025	...
4	0.356013	0.369441	...

	CKC Subgroup	height_low_inches \
0	11-A: Pointing Dogs	21.0
1	11-A: Pointing Dogs	21.0
2	4-B: Bull-and-Terrier Breeds	17.0
3	11-C: Retrievers and Waterdogs	21.0
4	12-A: Americas and Caribbean Breeds	5.0

	height_high_inches	average height	weight_low_lbs	weight_high_lbs \
0	26.0	23.5	45.0	70
1	26.0	23.5	45.0	70
2	22.0	19.5	30.0	75
3	25.0	23.0	55.0	80
4	10.0	7.5	1.0	7

	average weight	Lifespan Low	Lifespan High	average lifespan
0	57.5	10	12	11.0
1	57.5	10	12	11.0
2	52.5	10	12	11.0
3	67.5	10	12	11.0
4	4.0	14	16	15.0

[5 rows x 43 columns]

```
[27]: df_out_with_breeds_info['Est. lifespan remaining'] =
    ↪df_out_with_breeds_info['average lifespan'] - df_out_with_breeds_info['Age
    ↪upon Outcome (years)']
df_out_with_breeds_info['Est. lifespan remaining'] =
    ↪df_out_with_breeds_info['Est. lifespan remaining'].astype(dtype=float)
df_out_with_breeds_info.info()
df_out_with_breeds_info['Est. lifespan remaining']
```

```
<class 'pandas.core.frame.DataFrame'>
```

```
Int64Index: 149511 entries, 0 to 149510
```

```
Data columns (total 48 columns):
```

#	Column	Non-Null Count	Dtype
---	-----	-----	-----
0	Animal ID	149511 non-null	string
1	Name	106260 non-null	string
2	DateTime	149511 non-null	datetime64[ns]
3	MonthYear	149511 non-null	string
4	Date of Birth	149511 non-null	datetime64[ns]
5	Outcome Type	149485 non-null	string

6	Outcome Subtype	68443 non-null	string
7	Animal Type	149511 non-null	string
8	Sex upon Outcome	149509 non-null	string
9	Age upon Outcome	149465 non-null	string
10	Breed	149511 non-null	string
11	Color	149511 non-null	string
12	Colors (count)	149511 non-null	Int64
13	Color 0	149511 non-null	string
14	Color 1	79869 non-null	string
15	Color 0 R	135638 non-null	Float64
16	Color 0 G	135638 non-null	Float64
17	Color 0 B	135638 non-null	Float64
18	Color 0 H	135638 non-null	Float64
19	Color 0 S	135638 non-null	Float64
20	Color 0 V	135638 non-null	Float64
21	Color 1 R	78596 non-null	Float64
22	Color 1 G	78596 non-null	Float64
23	Color 1 B	78596 non-null	Float64
24	Color 1 H	78596 non-null	Float64
25	Color 1 S	78596 non-null	Float64
26	Color 1 V	78596 non-null	Float64
27	Age upon Outcome (years)	149465 non-null	Float64
28	Male	149509 non-null	boolean
29	Female	149509 non-null	boolean
30	NeuteredOrSpayed	149509 non-null	boolean
31	Adopted	149485 non-null	boolean
32	BreedsInfoName	138419 non-null	object
33	Breed (catalog)	138419 non-null	string
34	Breed Group AKC	138419 non-null	string
35	Breed Group CKC	138419 non-null	string
36	Breed Group UKC	138419 non-null	string
37	CKC Subgroup	138414 non-null	string
38	height_low_inches	138419 non-null	Float64
39	height_high_inches	138419 non-null	Float64
40	average height	138419 non-null	Float64
41	weight_low_lbs	138419 non-null	Float64
42	weight_high_lbs	138419 non-null	Int64
43	average weight	138419 non-null	Float64
44	Lifespan Low	138415 non-null	Int64
45	Lifespan High	138415 non-null	Int64
46	average lifespan	138419 non-null	Float64
47	Est. lifespan remaining	138408 non-null	float64

dtypes: Float64(19), Int64(4), boolean(4), datetime64[ns](2), float64(1), object(1), string(17)

memory usage: 55.8+ MB

```
[27]: 0          9.000000
      1         14.000000
      2          NaN
      3        11.666667
      4        10.983562
      ...
      149506       NaN
      149507        14.000000
      149508        12.750000
      149509        14.750000
      149510        10.833333
      Name: Est. lifespan remaining, Length: 149511, dtype: float64
```

There isn't much correlation appearing yet

```
[40]: df_breeds_with_info_corr = df_breeds_with_info.corr()

plt.figure(num=None, figsize=(12, 10), dpi=96, facecolor='w', edgecolor='k')
sns.heatmap(data=df_breeds_with_info_corr.abs())

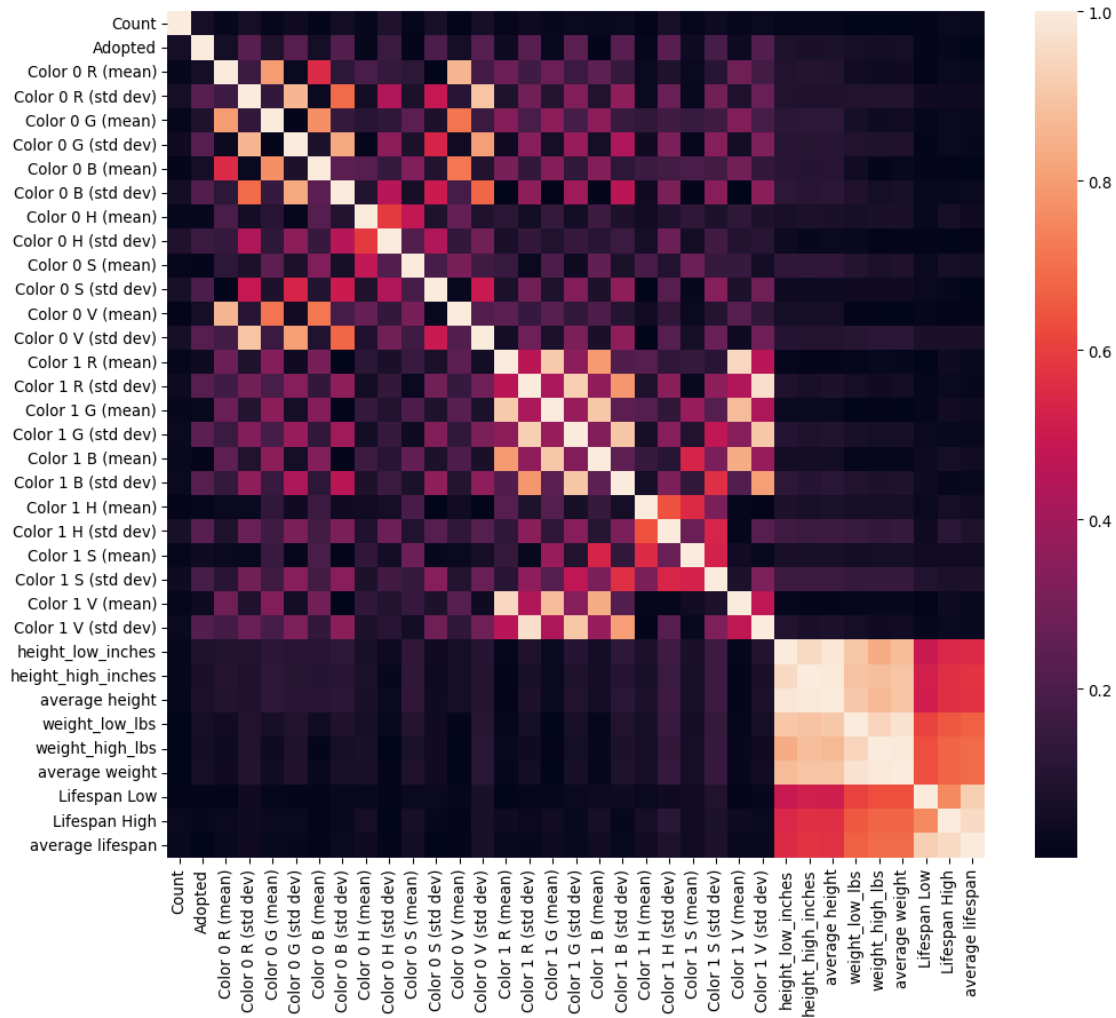
def score(df, var1, var2):
    print(f'Corr({var1}, {var2})    {df[var1][var2]}')

score(df_breeds_with_info_corr, 'Adopted', 'Color 0 B (mean)')
score(df_breeds_with_info_corr, 'Adopted', 'Color 0 B (std dev)')
score(df_breeds_with_info_corr, 'Adopted', 'Color 0 V (mean)')
score(df_breeds_with_info_corr, 'Adopted', 'Color 0 V (std dev)')
score(df_breeds_with_info_corr, 'Adopted', 'average height')
score(df_breeds_with_info_corr, 'Adopted', 'height_low_inches')
score(df_breeds_with_info_corr, 'Adopted', 'height_high_inches')
score(df_breeds_with_info_corr, 'Adopted', 'Lifespan Low')
```

/tmp/ipykernel_29164/4118066584.py:1: FutureWarning: The default value of numeric_only in DataFrame.corr is deprecated. In a future version, it will default to False. Select only valid columns or specify the value of numeric_only to silence this warning.

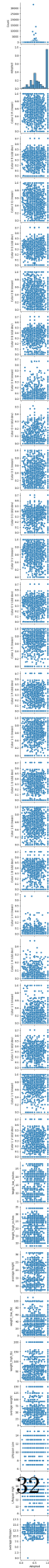
```
df_breeds_with_info_corr = df_breeds_with_info.corr()

Corr(Adopted, Color 0 B (mean))    -0.057521961020765885
Corr(Adopted, Color 0 B (std dev)) -0.21220098425344674
Corr(Adopted, Color 0 V (mean))    -0.05892713325516749
Corr(Adopted, Color 0 V (std dev)) -0.22375794566214077
Corr(Adopted, average height)     0.07520172186737319
Corr(Adopted, height_low_inches)   0.08043859187253975
Corr(Adopted, height_high_inches)  0.06827302387620472
Corr(Adopted, Lifespan Low)        0.011194168083224364
```



```
[41]: sns.pairplot(data=df_breeds_with_info, x_vars=['Adopted'])
```

```
[41]: <seaborn.axisgrid.PairGrid at 0x7f64c1bdeb90>
```

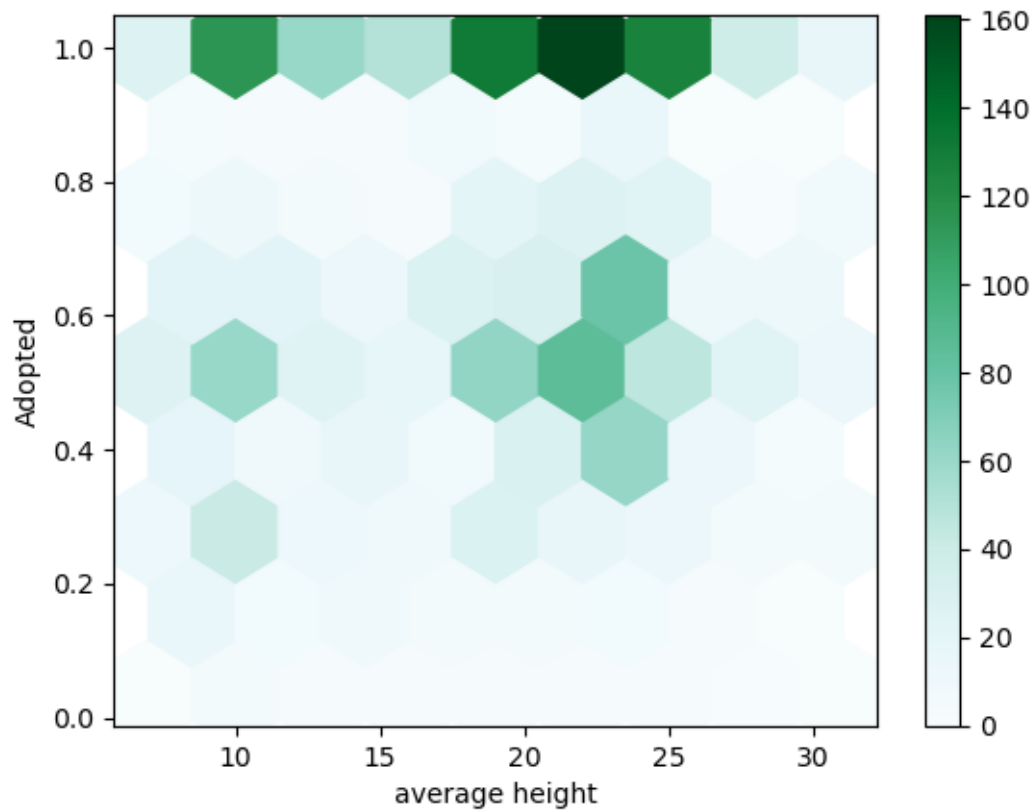


2.2 Height ~ adopted?

Is the average height of a breed correlated with its likelihood of being adopted? The Pearson correlation coefficient was $\text{Corr}(\text{Adopted}, \text{average height}) = 0.2286839421877296$.

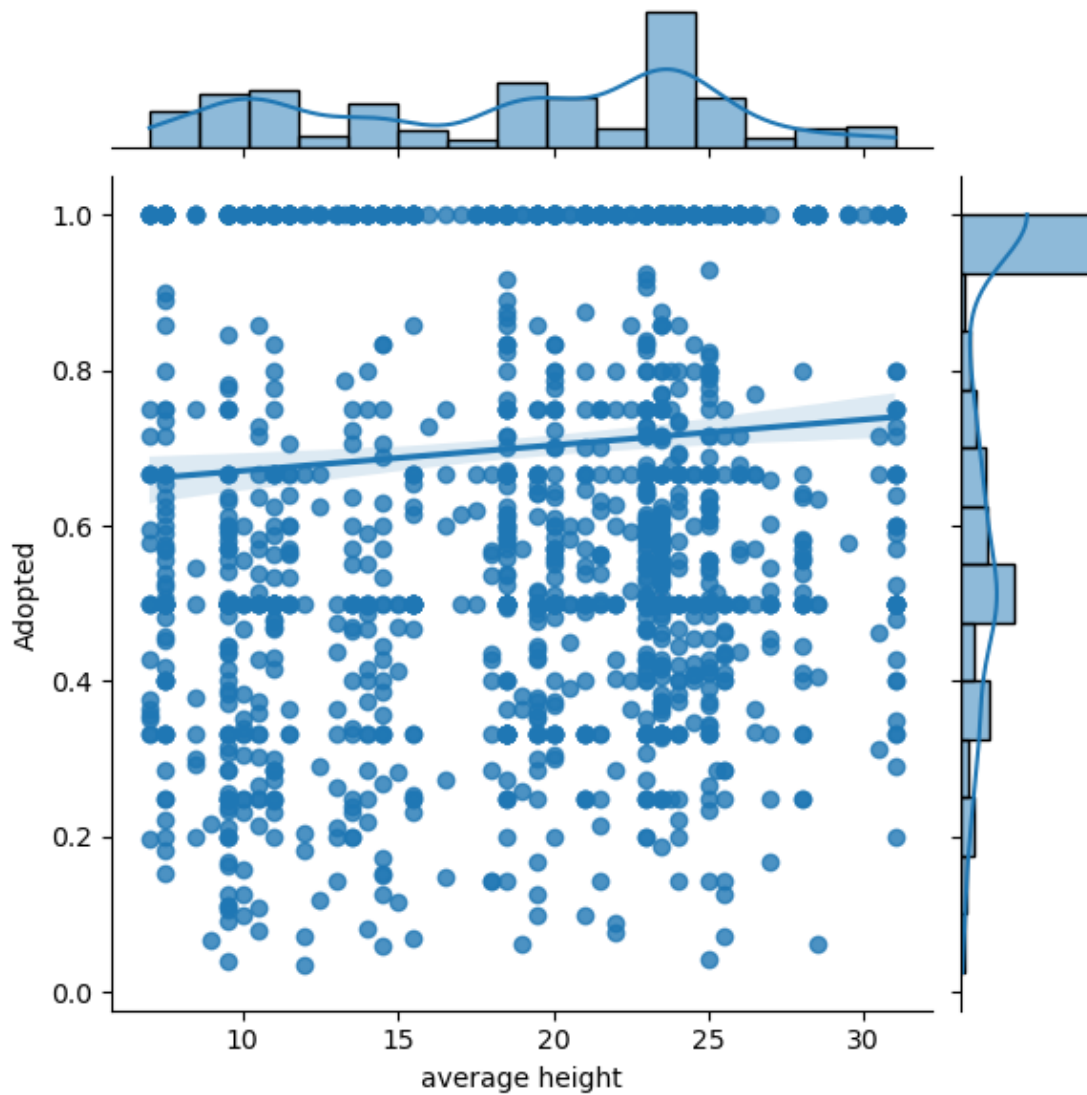
```
[30]: df_breeds_with_info.plot.hexbin(x='average height', y='Adopted', gridsize=8)
```

```
[30]: <AxesSubplot:xlabel='average height', ylabel='Adopted'>
```



```
[31]: sns.jointplot(  
    x=df_breeds_with_info['average height'].astype(dtype=float),  
    y=df_breeds_with_info.Adopted.astype(dtype=float),  
    kind='reg')
```

```
[31]: <seaborn.axisgrid.JointGrid at 0x7f64c9657af0>
```



3 Analysis by individuals

3.1 Color

(results)

```
[56]: print('Colors')
      print(df_out_with_breeds_info['Color 0'].unique())
      print(df_out_with_breeds_info['Color 1'].unique())
```

```
Colors
<StringArray>
[      'Brown Tabby',          'White',          'Gray',
```

```

        'Buff',      'Orange Tabby',      'Brown',
        'Black',      'Blue',      'Calico',
        'Tricolor',    'Brown Brindle',    'Tan',
        'Chocolate',    'Red',      'Blue Tick',
        'Tortie',      'Sable',      'Cream Tabby',
        'Blue Tabby',    'Blue Merle',    'Brown Merle',
        'Silver',      'Apricot',    'Tortie Point',
        'Seal Point',    'Torbie',      'Fawn',
        'Lynx Point',    'Cream',    'Black Brindle',
        'Yellow',    'Chocolate Point',    'Blue Smoke',
        'Silver Tabby',    'Gray Tabby',    'Orange',
        'Brown Tiger',    'Yellow Brindle',    'Gold',
        'Black Tabby',    'Flame Point',    'Calico Point',
        'Green',      'Black Smoke',    'Blue Cream',
        'Lilac Point',    'Red Merle',      'Liver',
        'Blue Point',    'Red Tick',      'Liver Tick',
        'Black Tiger',    'Pink',      'Blue Tiger',
        'Agouti', 'Silver Lynx Point',    'Cream Tiger',
        'Orange Tiger',    'Ruddy',      'Unknown']
Length: 60, dtype: string
<StringArray>
[
    'White',      'Brown',      <NA>,      'Orange Tabby',
    'Blue',      'Tan',      'Black',      'Blue Tabby',
    'Gray',      'Brown Tabby',    'Tricolor',    'Brown Brindle',
    'Buff',      'Yellow Brindle',    'Red',      'Blue Tick',
    'Cream',      'Orange',      'Chocolate',    'Cream Tabby',
    'Red Tick',    'Blue Merle',    'Tortie',      'Red Merle',
    'Silver',      'Black Tabby',    'Fawn',      'Yellow',
    'Gray Tabby',    'Seal Point',    'Pink',      'Gold',
    'Calico',      'Brown Merle',    'Gray Tiger',    'Black Brindle',
    'Blue Cream',    'Liver',      'Agouti',      'Blue Point',
    'Green',      'Flame Point',    'Lynx Point',    'Black Smoke',
    'Blue Tiger',    'Apricot',      'Liver Tick',    'Chocolate Point',
    'Black Tiger',    'Tortie Point',    'Silver Tabby',    'Lilac Point',
    'Brown Tiger',    'Calico Point']
Length: 54, dtype: string

```

```

[59]: df_out_colors_1 = df_out.loc[(df_out['Color 0'].notna() == True) &
    ↪(df_out['Color 1'].notna() == False)]
df_out_colors_2 = df_out.loc[(df_out['Color 0'].notna() == True) &
    ↪(df_out['Color 1'].notna() == True)]

```

```

[77]: def bigCorr_bernoulli_custom_colors_2():
    df_out_colors_2_color_0 = df_out_colors_2[['Color 0', 'Adopted']].
    ↪rename(columns={'Color 0': 'Color'})
    df_out_colors_2_color_1 = df_out_colors_2[['Color 1', 'Adopted']].
    ↪rename(columns={'Color 1': 'Color'})

```

```

    numerator = (
        df_out_colors_2_color_0.groupby('Color').value_counts() +
        df_out_colors_2_color_1.groupby('Color').value_counts()
    )

    denominator = (
        df_out_colors_2_color_0[['Color']].groupby('Color').value_counts() +
        df_out_colors_2_color_1[['Color']].groupby('Color').value_counts()
    )

    return (numerator.div(denominator))[:,True]

def bigCorr_bernoulli_custom_colors_1_or_2():
    df_out_colors_1_color_0 = df_out_colors_1[['Color 0', 'Adopted']].
    ↪rename(columns={'Color 0': 'Color'})
    df_out_colors_2_color_0 = df_out_colors_2[['Color 0', 'Adopted']].
    ↪rename(columns={'Color 0': 'Color'})
    df_out_colors_2_color_1 = df_out_colors_2[['Color 1', 'Adopted']].
    ↪rename(columns={'Color 1': 'Color'})

    numerator = (
        df_out_colors_1_color_0.groupby('Color').value_counts() +
        df_out_colors_2_color_0.groupby('Color').value_counts() +
        df_out_colors_2_color_1.groupby('Color').value_counts()
    )

    denominator = (
        df_out_colors_1_color_0[['Color']].groupby('Color').value_counts() +
        df_out_colors_2_color_0[['Color']].groupby('Color').value_counts() +
        df_out_colors_2_color_1[['Color']].groupby('Color').value_counts()
    )

    return (numerator.div(denominator))[:,True]

```

```

[80]: def chartColorAdoptionLikelihood(df_colors, color_relation):
    plt.figure(num=None, figsize=(5, 12), dpi=96, facecolor='w', edgecolor='k')
    plt.title(f'Probability of an animal with this {color_relation} color being_
    ↪adopted')
    df_colors.Adopted.plot.barh(x='Color')
    plt.show()
    print(f'{len(df_colors)} colors')
    print()

def colors_single():
    colors_adopted = bigCorr_bernoulli(df_out_colors_1, 'Color 0', 'Adopted')
    colors_count = df_out_colors_1['Color 0'].value_counts()

```

```

df_colors = pd.DataFrame(index=colors_count.index)
df_colors = df_colors.assign(Color=colors_count.index, Count=colors_count,
↳Adopted=colors_adopted)
df_colors.sort_values(by='Adopted', ascending=False, inplace=True)
chartColorAdoptionLikelihood(df_colors, 'single')

def colors_mixed():
    colors_adopted = bigCorr_bernoulli_custom_colors_2()
    colors_count = df_out_colors_2['Color 0'].value_counts() +
↳df_out_colors_2['Color 1'].value_counts()
    df_colors = pd.DataFrame(index=colors_count.index)
    df_colors = df_colors.assign(Color=colors_count.index, Count=colors_count,
↳Adopted=colors_adopted)
    df_colors.sort_values(by='Adopted', ascending=False, inplace=True)
    chartColorAdoptionLikelihood(df_colors, 'mixed')

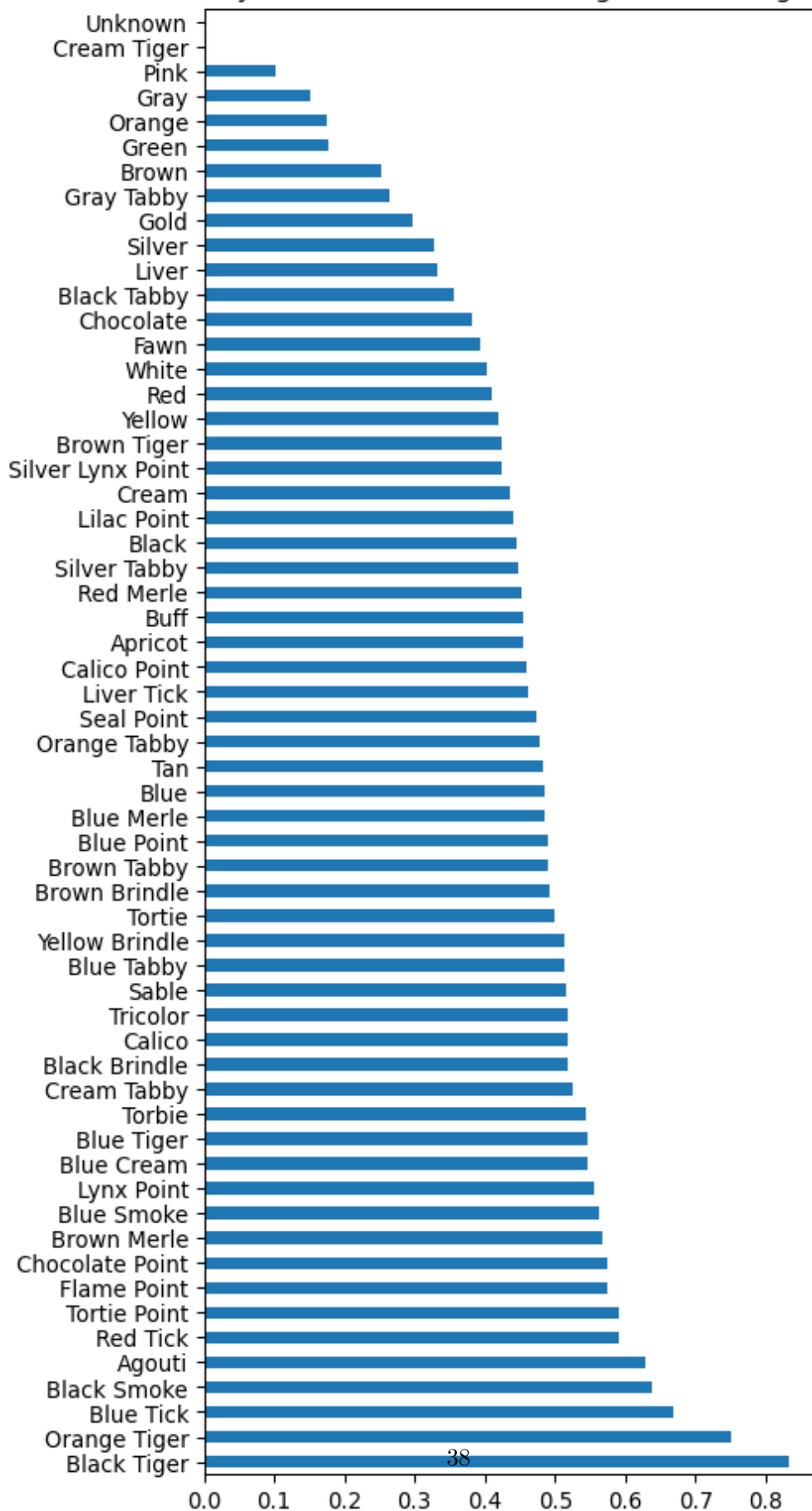
def colors_singleOrMixed():
    colors_adopted = bigCorr_bernoulli_custom_colors_1_or_2()
    colors_count = df_out_colors_1['Color 0'].value_counts() +
↳df_out_colors_2['Color 0'].value_counts() + df_out_colors_2['Color 1'].
↳value_counts()
    df_colors = pd.DataFrame(index=colors_count.index)
    df_colors = df_colors.assign(Color=colors_count.index, Count=colors_count,
↳Adopted=colors_adopted)
    df_colors.sort_values(by='Adopted', ascending=False, inplace=True)
    chartColorAdoptionLikelihood(df_colors, 'single or mixed')

colors_single()
colors_mixed()
colors_singleOrMixed()

df_colors_outcomes = df_out_colors_1[['Outcome Type', 'Color 0']]
plt.figure(num=None, figsize=(5, 12), dpi=96, facecolor='w', edgecolor='k')
plt.title('Probability of an animal with this solid color having a certain
↳outcome')
sns.histplot(
    data=df_colors_outcomes,
    y='Color 0',
    hue='Outcome Type',
    multiple='fill',
)

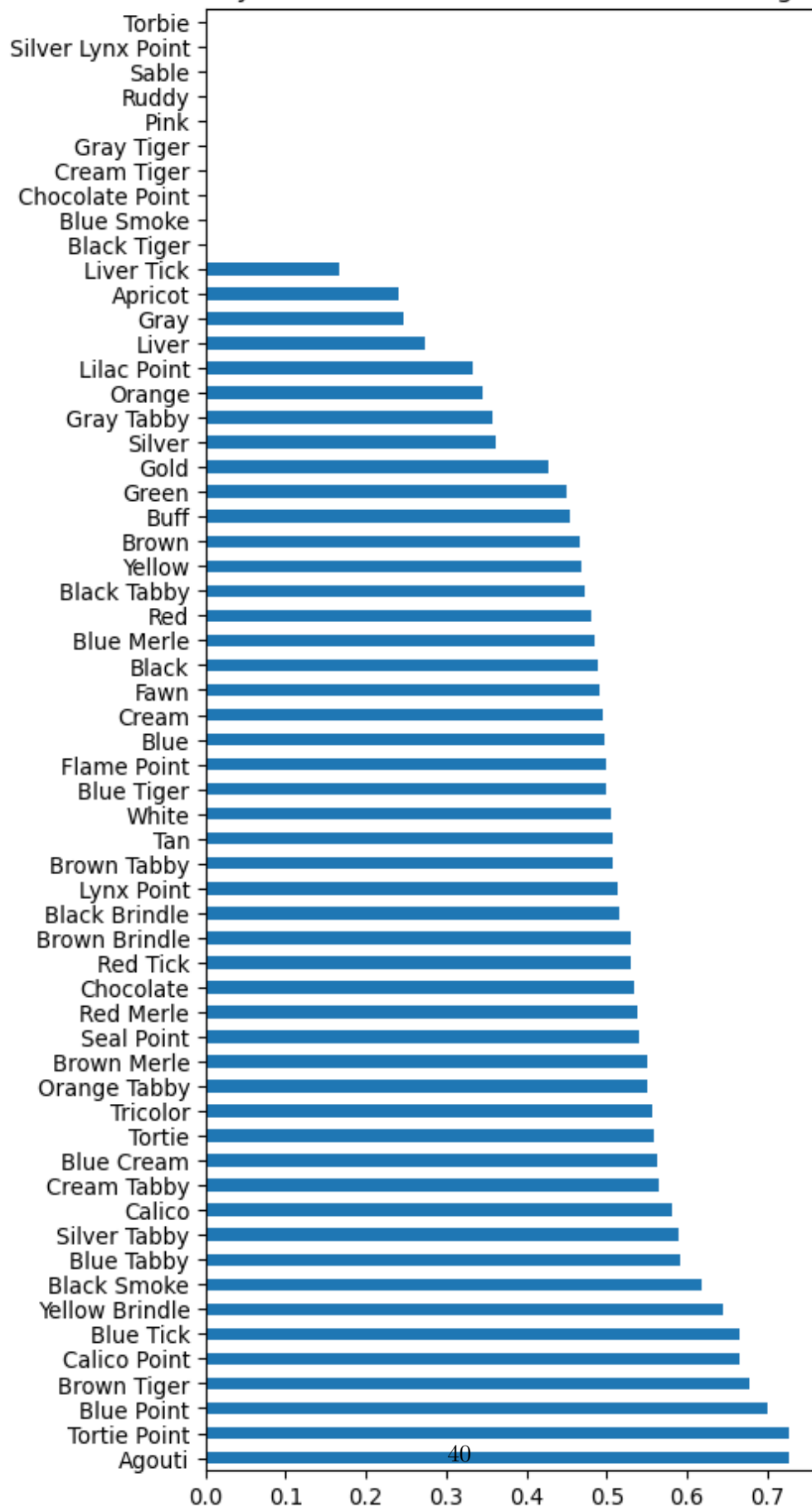
```

Probability of an animal with this single color being adopted

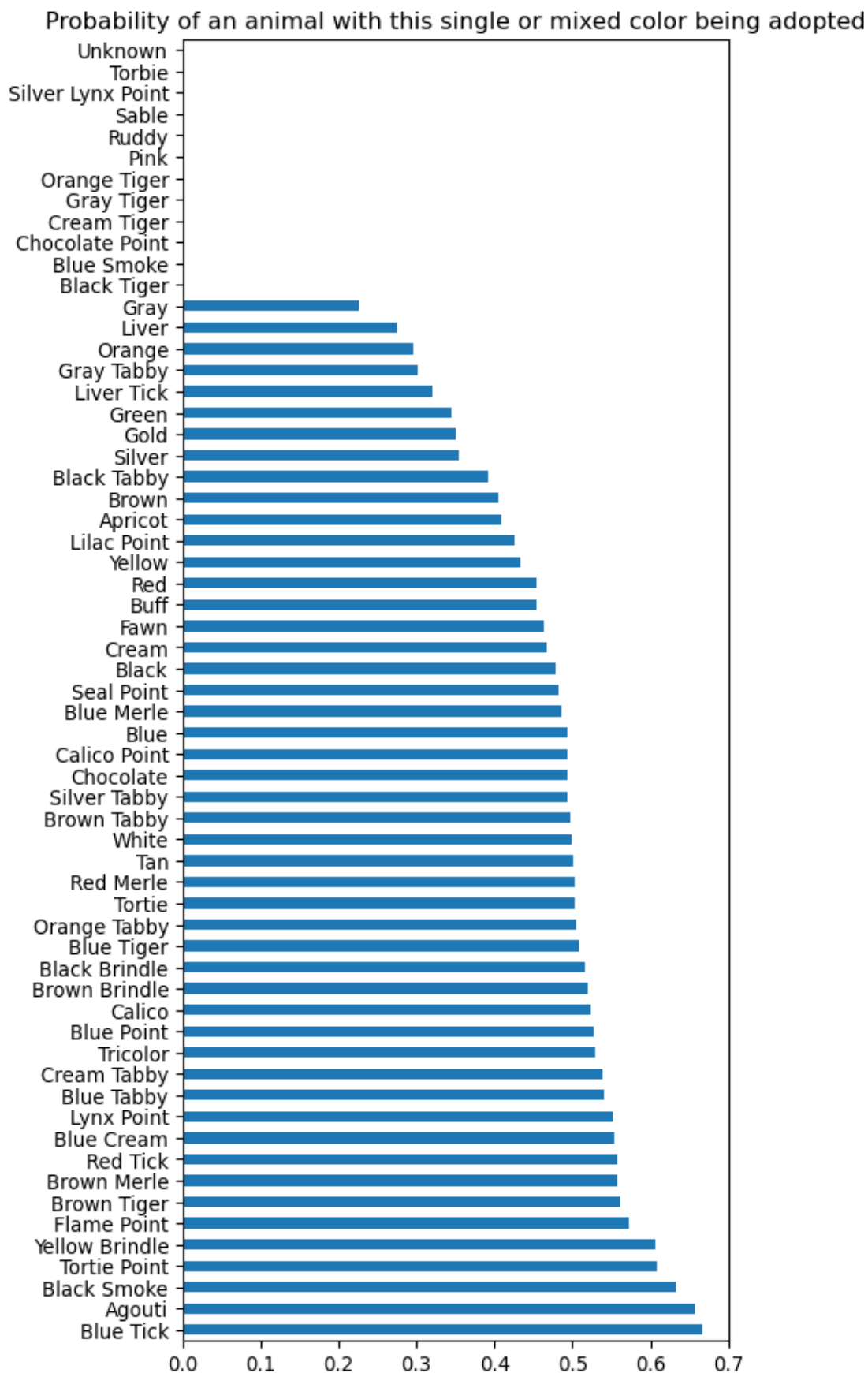


59 colors

Probability of an animal with this mixed color being adopted

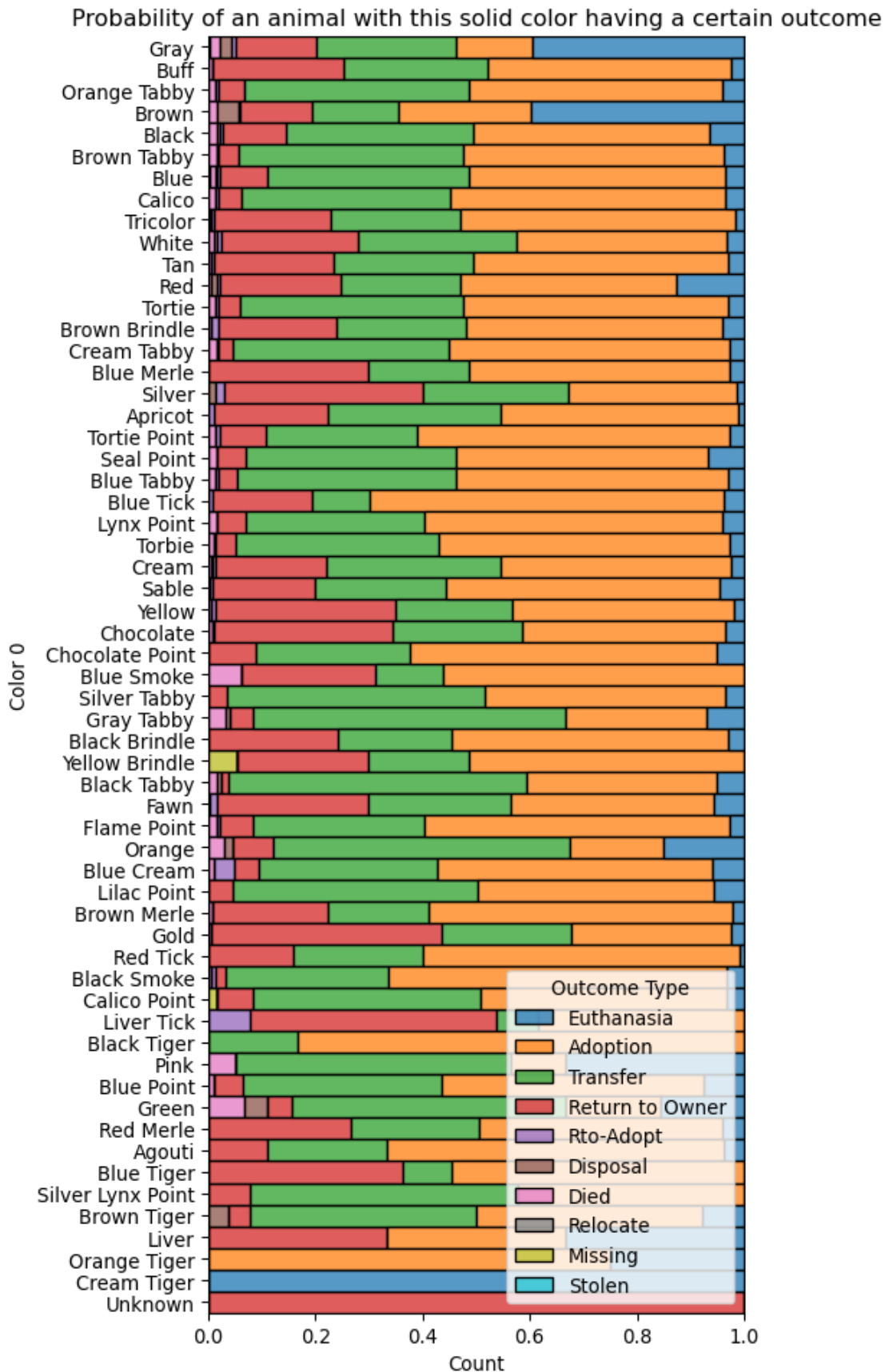


59 colors



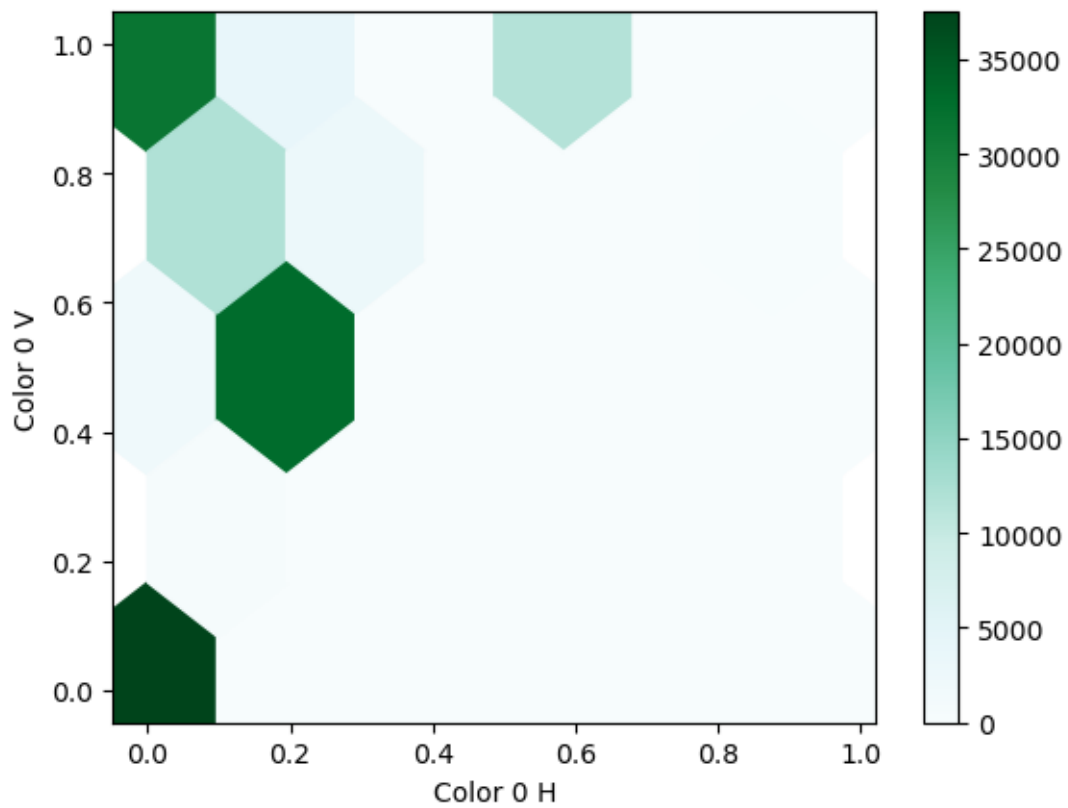
61 colors

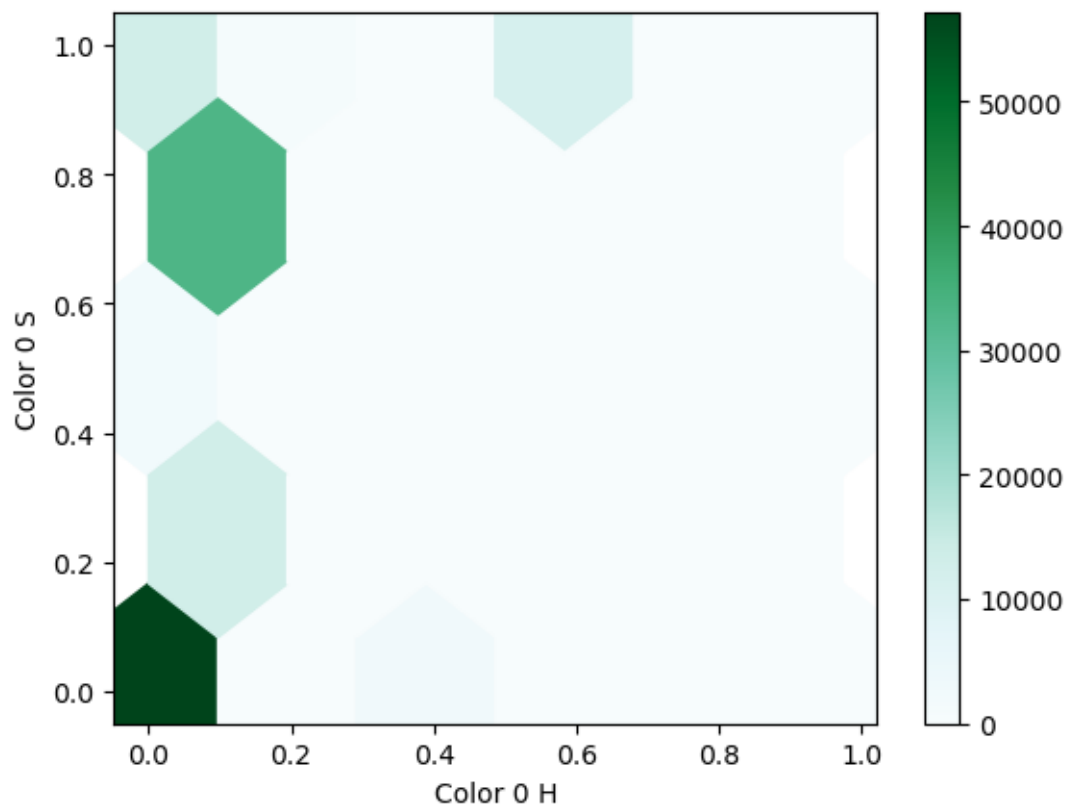
```
[80]: <AxesSubplot:title={'center': 'Probability of an animal with this solid color  
having a certain outcome'}, xlabel='Count', ylabel='Color 0'>
```

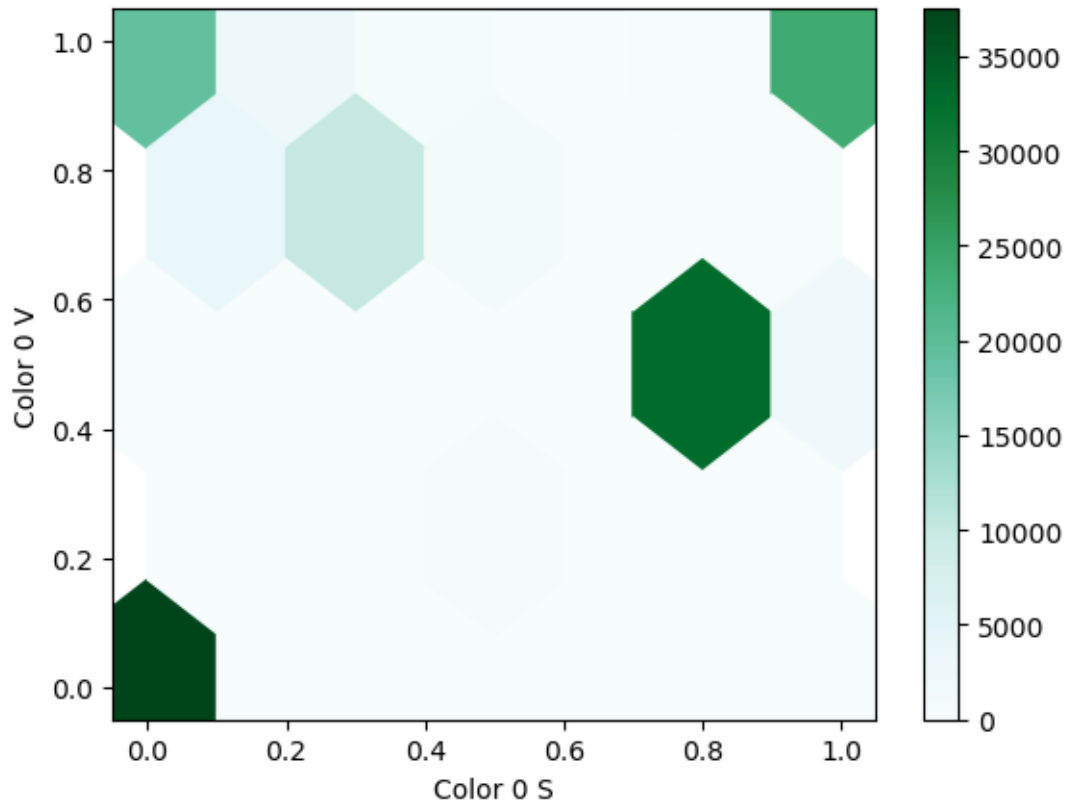


```
[34]: df_out.plot.hexbin(x='Color 0 H', y='Color 0 V', gridsize=5)
df_out.plot.hexbin(x='Color 0 H', y='Color 0 S', gridsize=5)
df_out.plot.hexbin(x='Color 0 S', y='Color 0 V', gridsize=5)
```

```
[34]: <AxesSubplot:xlabel='Color 0 S', ylabel='Color 0 V'>
```







3.2 Breed characteristics

This analysis considers individual animals and looks for correlations between characteristics of their breed and their outcome.

It looks like the animals belonging to a breed with an average height around 20-25 (inches?) are more likely to be adopted than others, and animals between 5-12 inches are less likely than others to be adopted.

TODO: interpret the other graphs. Why are the different lifespan variables distributed the way they are, and why are they distributed differently compared to each other?

```
[35]: df_out_1 = df_out.assign(Adopted=df_out.Adopted.fillna(False))
df_out_with_breeds_info_1 = df_out_with_breeds_info.assign(Adopted=df_out.
    ↳Adopted.fillna(False))

def correlo_histogram(df, independent, dependent, binwidth):
    print(f'{independent} ~ {dependent}')
    sns.histplot(data=df,
                  x=independent,
                  hue=dependent,
                  multiple='fill',
```

```

        binwidth=binwidth)
plt.show()

independent_vars_breeds_info = [
    ['average height', 2],
    ['Est. lifespan remaining', 1],
    ['average lifespan', 1],
    ['Lifespan Low', 1],
    ['Lifespan High', 1]
]

independent_vars_individuals = [
    ['Age upon Outcome (years)', 1],
    ['Color O H', 0.1],
    ['Color O S', 0.1],
    ['Color O V', 0.1]
]

for [independent, binwidth] in independent_vars_breeds_info:
    for dependent in ['Adopted', 'Outcome Type']:
        correlo_histogram(df_out_with_breeds_info_1, independent, dependent,
                           binwidth)

for [independent, binwidth] in independent_vars_individuals:
    for dependent in ['Adopted', 'Outcome Type']:
        correlo_histogram(df_out_1, independent, dependent, binwidth)

```

average height ~ Adopted

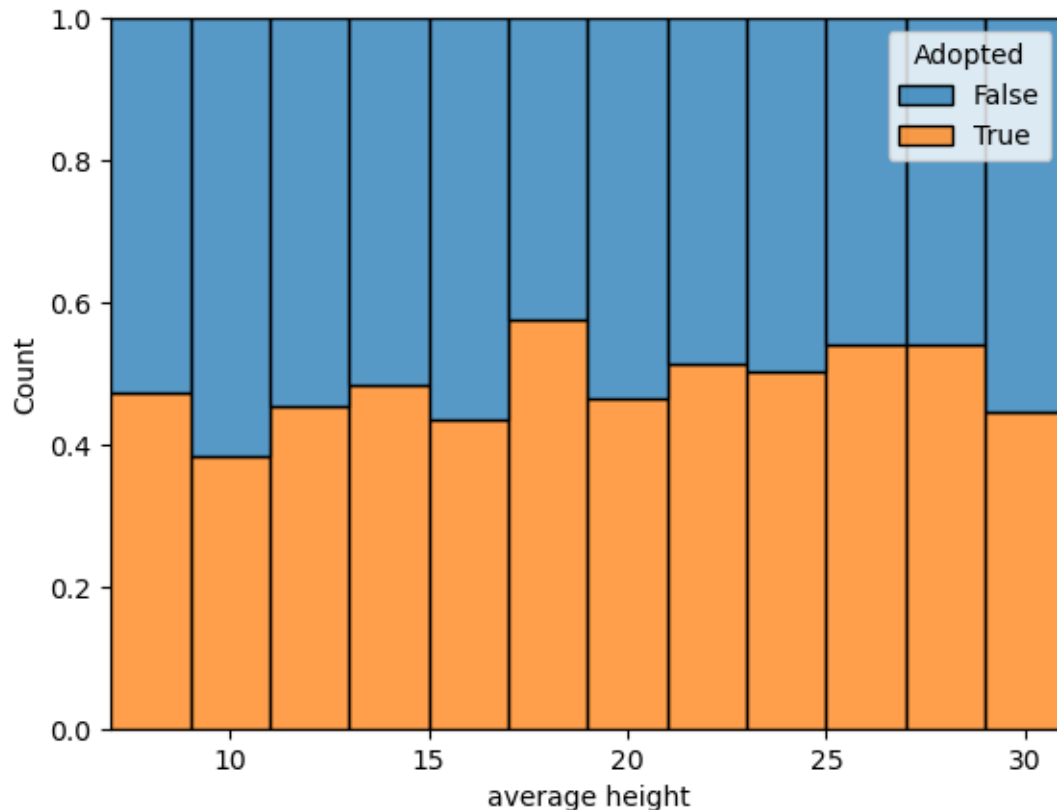
```

/home/isaac/miniconda3/envs/cse3380/lib/python3.10/site-
packages/seaborn/distributions.py:499: FutureWarning: In a future version, the
Index constructor will not infer numeric dtypes when passed object-dtype
sequences (matching Series behavior)
    pd.Index(edges, name="edges"),
/home/isaac/miniconda3/envs/cse3380/lib/python3.10/site-
packages/seaborn/distributions.py:500: FutureWarning: In a future version, the
Index constructor will not infer numeric dtypes when passed object-dtype
sequences (matching Series behavior)
    pd.Index(widths, name="widths"),
/home/isaac/miniconda3/envs/cse3380/lib/python3.10/site-
packages/seaborn/distributions.py:499: FutureWarning: In a future version, the
Index constructor will not infer numeric dtypes when passed object-dtype
sequences (matching Series behavior)
    pd.Index(edges, name="edges"),
/home/isaac/miniconda3/envs/cse3380/lib/python3.10/site-
packages/seaborn/distributions.py:500: FutureWarning: In a future version, the
Index constructor will not infer numeric dtypes when passed object-dtype
sequences (matching Series behavior)

```



```
pd.Index(widths, name="widths"),
```



average height ~ Outcome Type

```
/home/isaac/miniconda3/envs/cse3380/lib/python3.10/site-  
packages/seaborn/distributions.py:499: FutureWarning: In a future version, the  
Index constructor will not infer numeric dtypes when passed object-dtype  
sequences (matching Series behavior)
```

```
pd.Index(edges, name="edges"),
```

```
/home/isaac/miniconda3/envs/cse3380/lib/python3.10/site-  
packages/seaborn/distributions.py:500: FutureWarning: In a future version, the  
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```

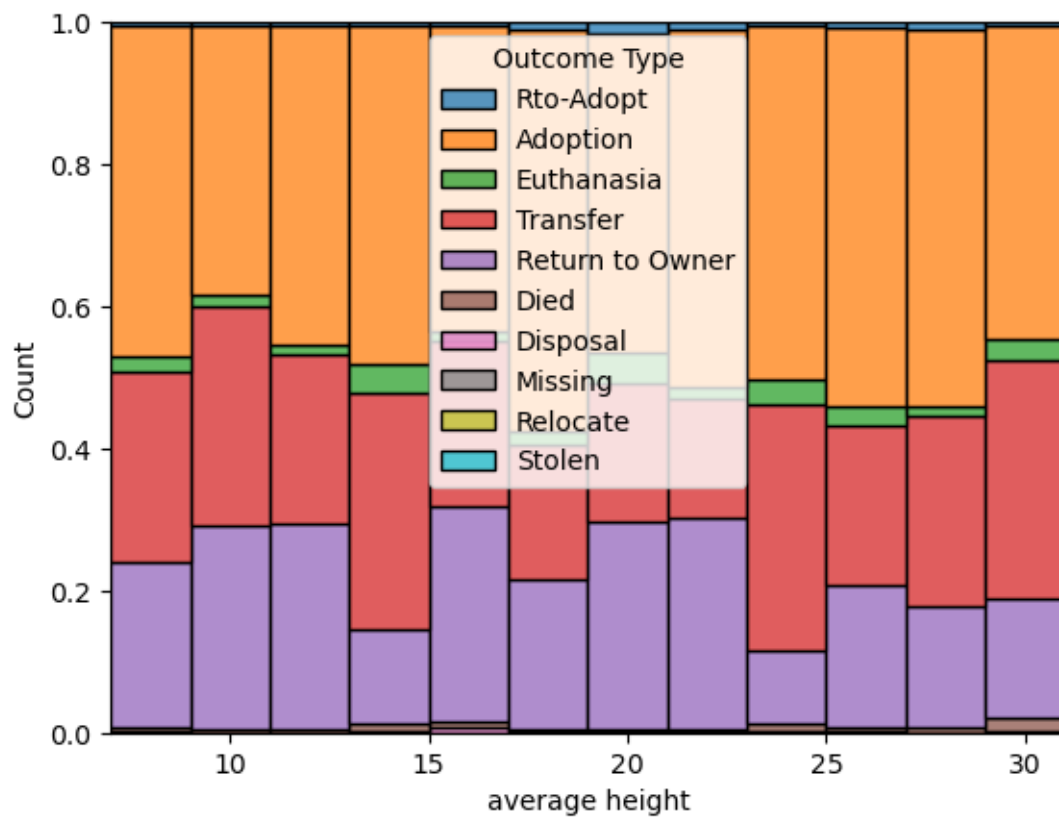
sequences (matching Series behavior)
    pd.Index(widths, name="widths"),
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/home/isaac/miniconda3/envs/cse3380/lib/python3.10/site-

```

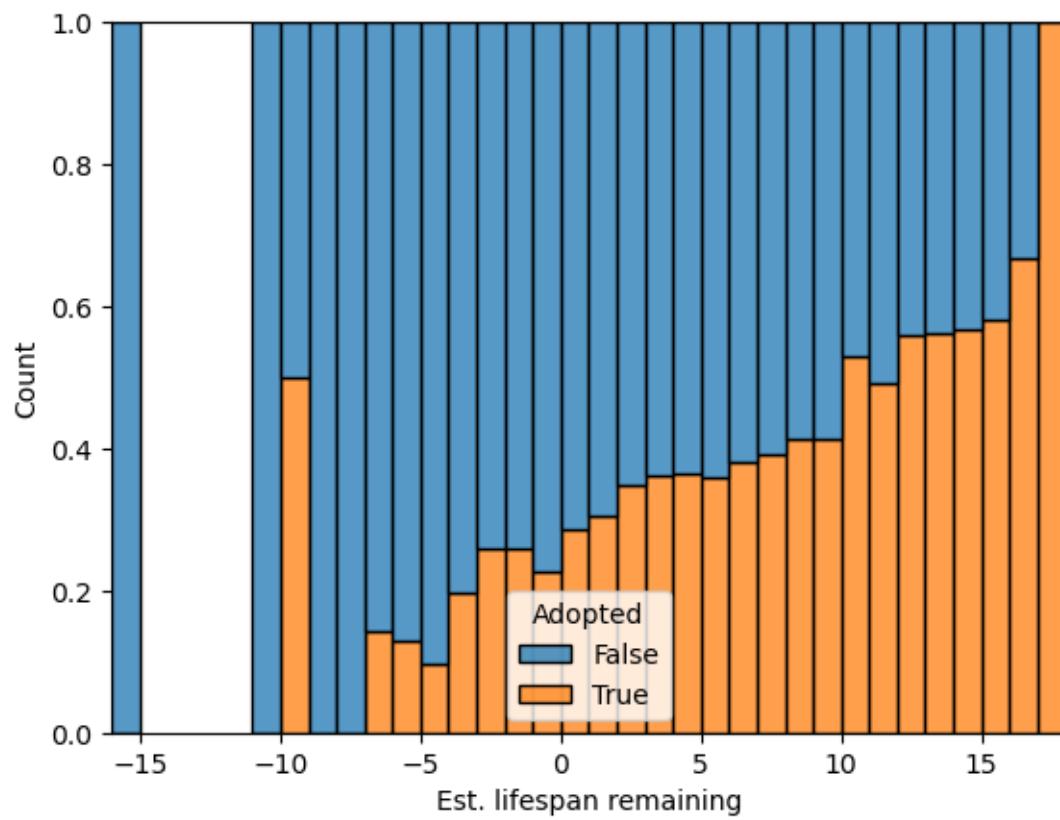
```

packages/seaborn/distributions.py:500: FutureWarning: In a future version, the
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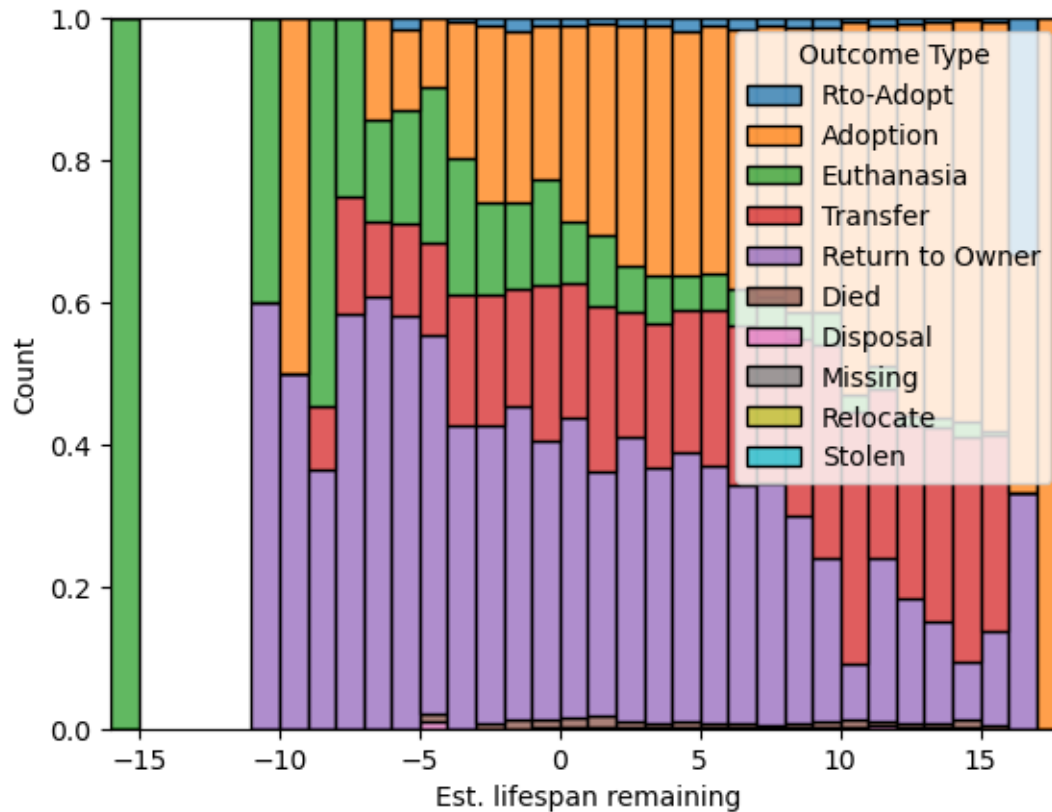
```



Est. lifespan remaining ~ Adopted



Est. lifespan remaining ~ Outcome Type



average lifespan ~ Adopted

```
/home/isaac/miniconda3/envs/cse3380/lib/python3.10/site-
packages/seaborn/distributions.py:499: FutureWarning: In a future version, the
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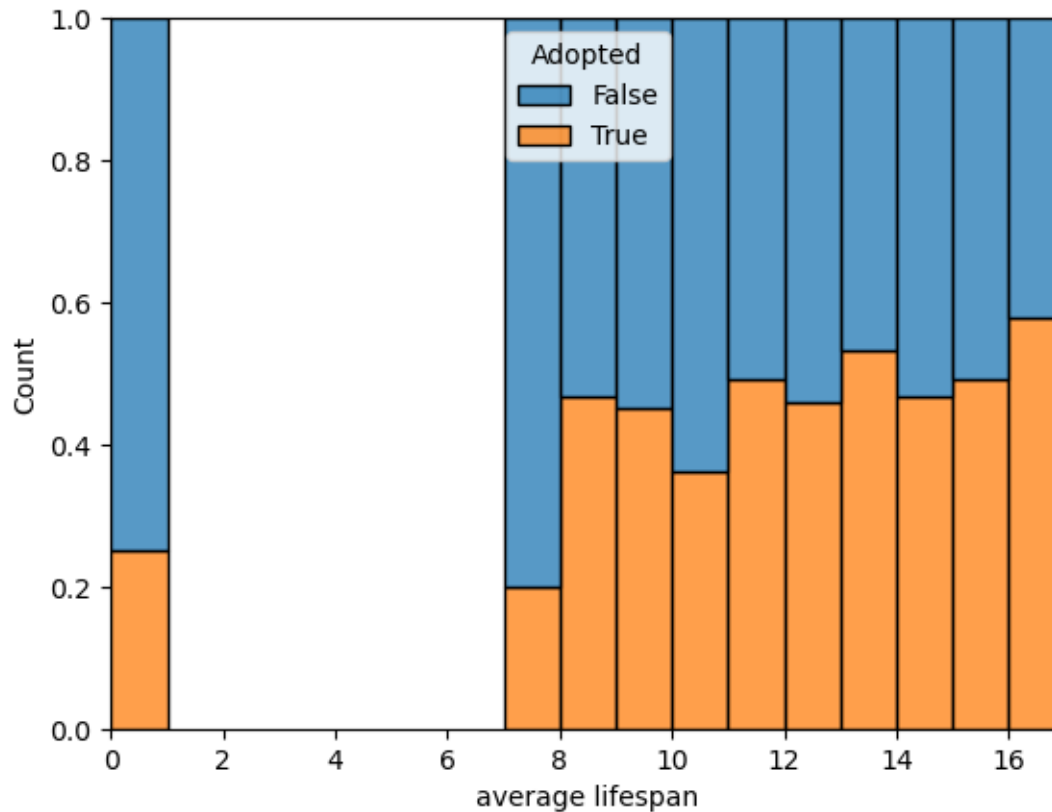
```
pd.Index(widths, name="widths"),
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```
/home/isaac/miniconda3/envs/cse3380/lib/python3.10/site-
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average lifespan ~ Outcome Type

```
/home/isaac/miniconda3/envs/cse3380/lib/python3.10/site-
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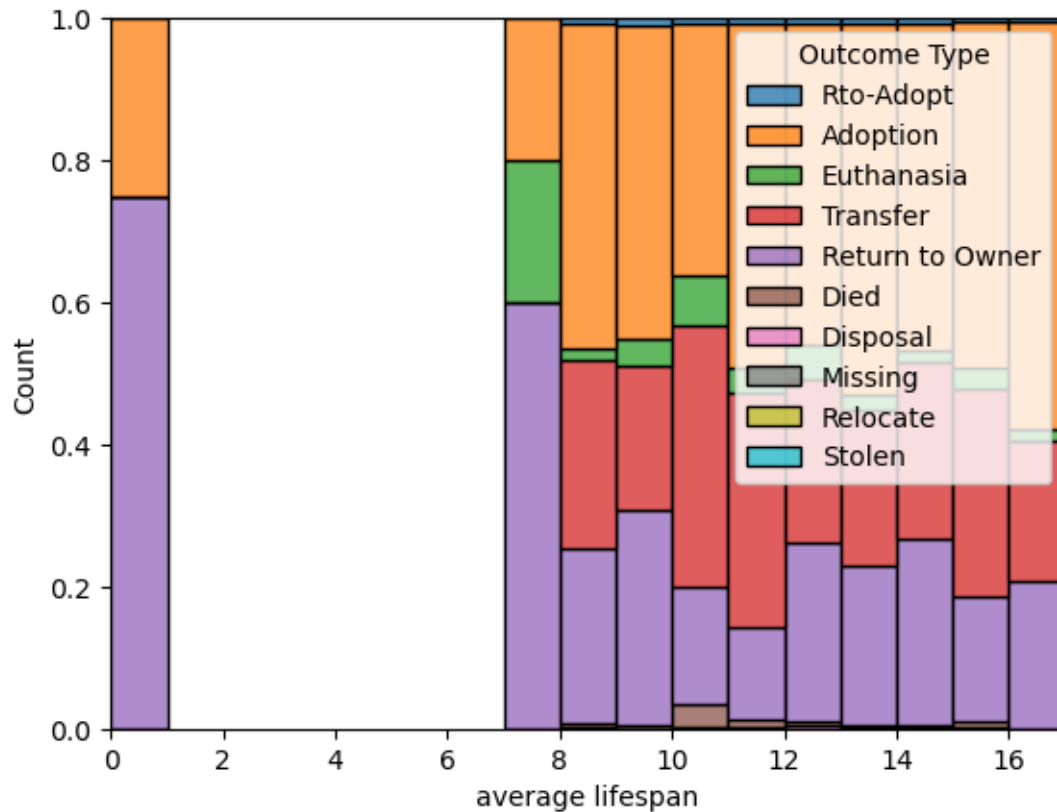
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```

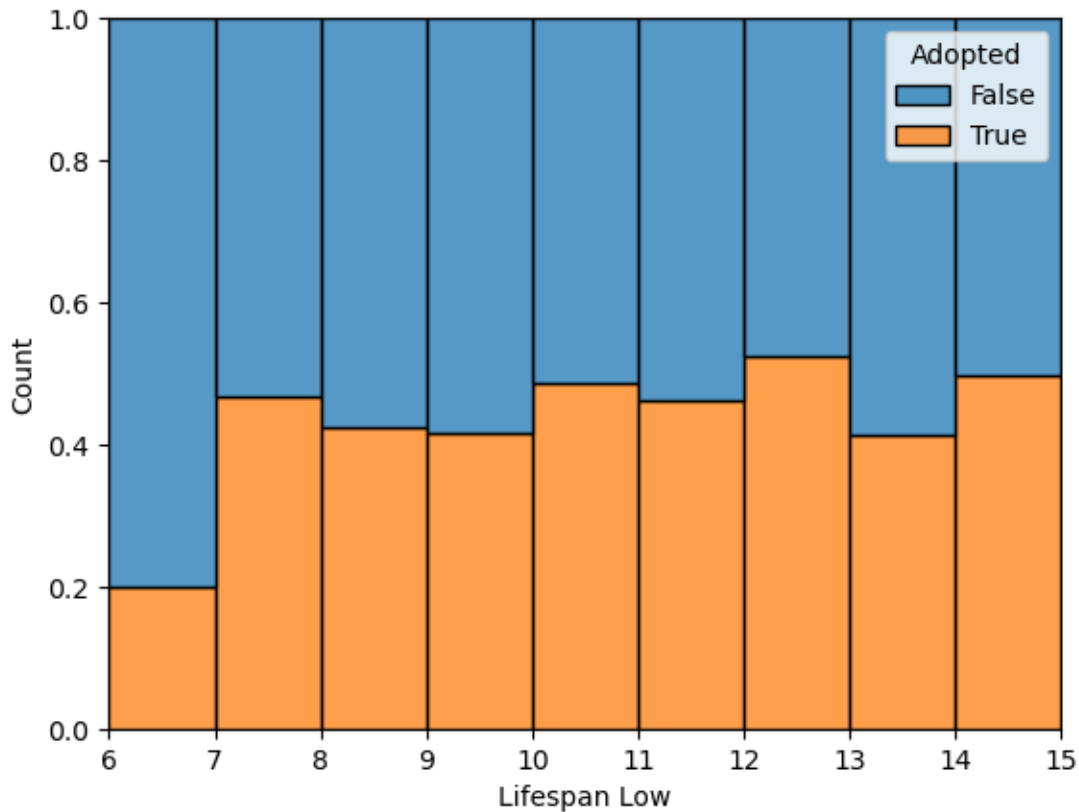


Lifespan Low ~ Adopted

```

/home/isaac/miniconda3/envs/cse3380/lib/python3.10/site-
packages/seaborn/distributions.py:499: FutureWarning: In a future version, the
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```



Lifespan Low ~ Outcome Type

```
/home/isaac/miniconda3/envs/cse3380/lib/python3.10/site-
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```

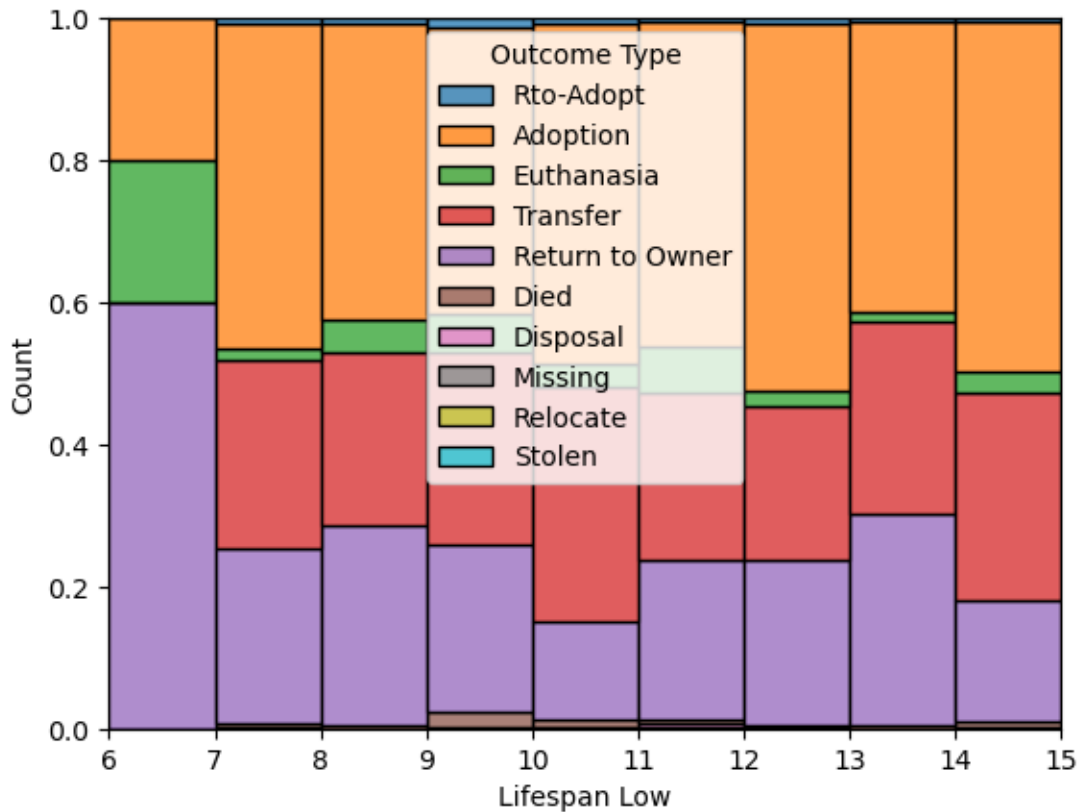
```
pd.Index(widths, name="widths"),
```



```

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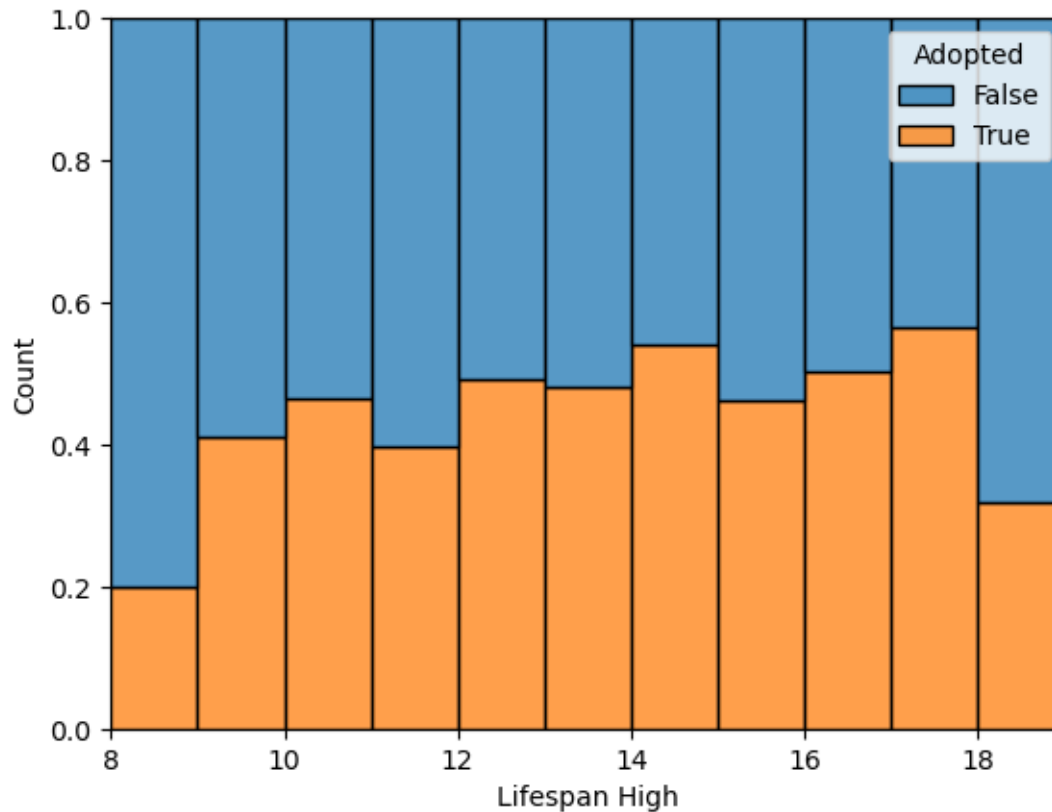


Lifespan High ~ Adopted

```

/home/isaac/miniconda3/envs/cse3380/lib/python3.10/site-
packages/seaborn/distributions.py:499: FutureWarning: In a future version, the
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Lifespan High ~ Outcome Type

```
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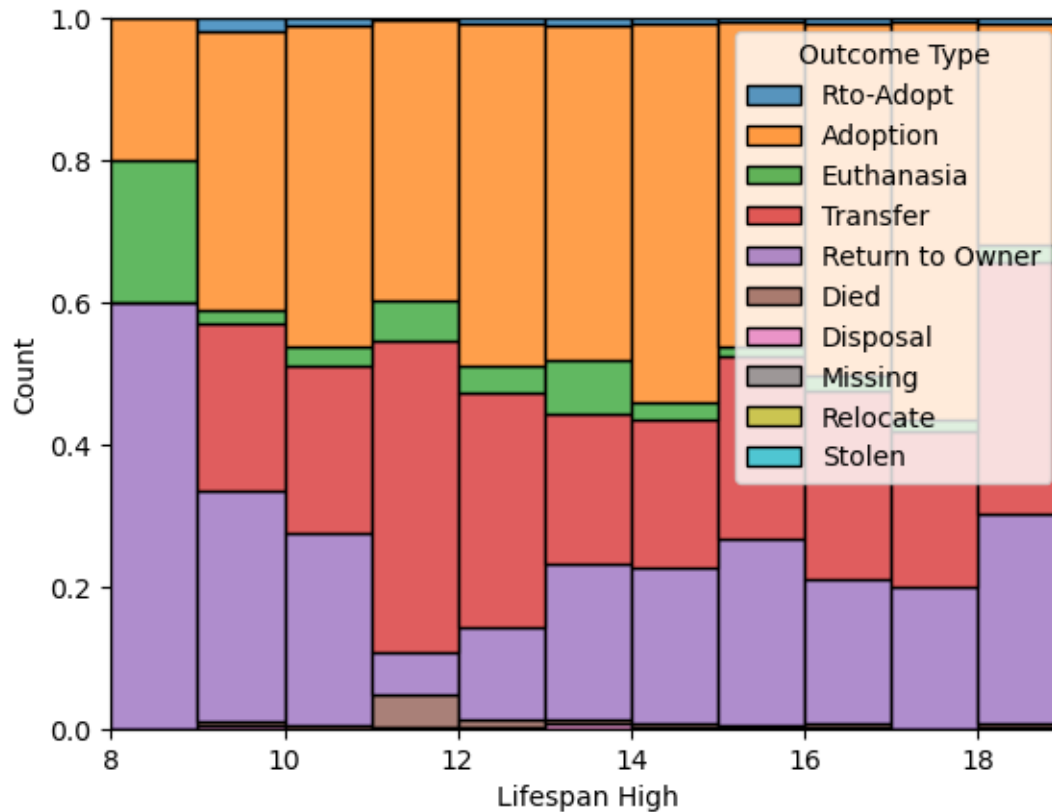
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Age upon Outcome (years) ~ Adopted

```
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```

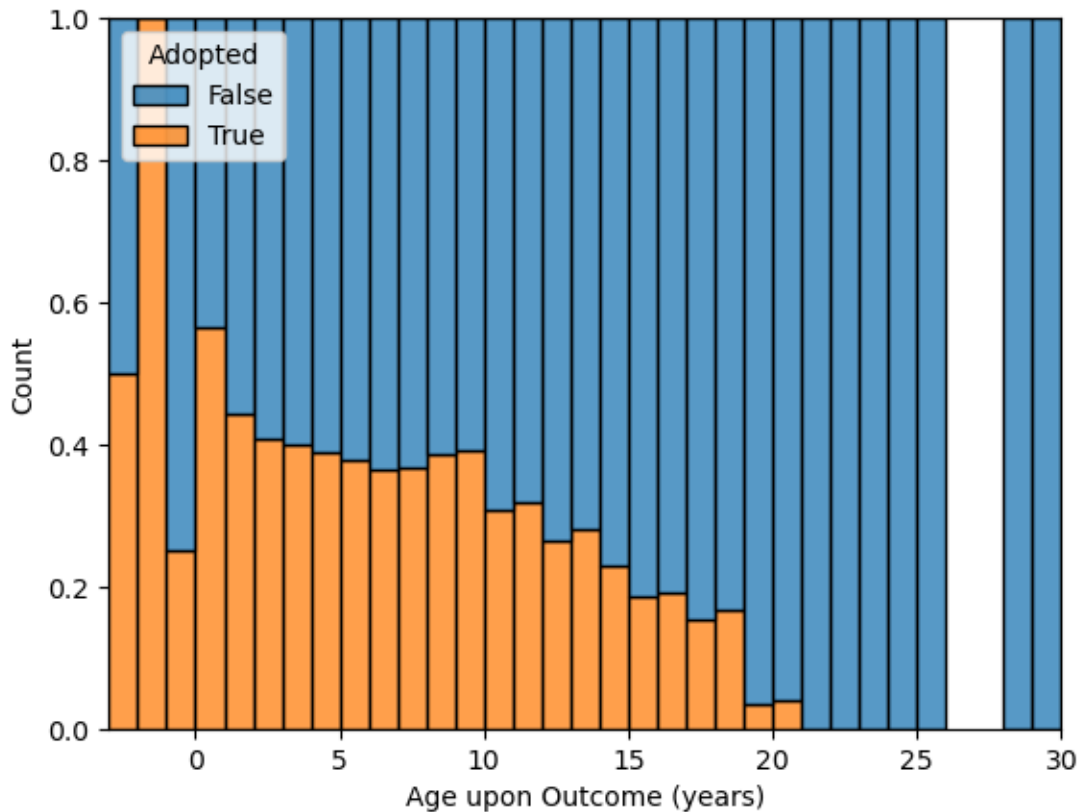
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```



Age upon Outcome (years) ~ Outcome Type

```
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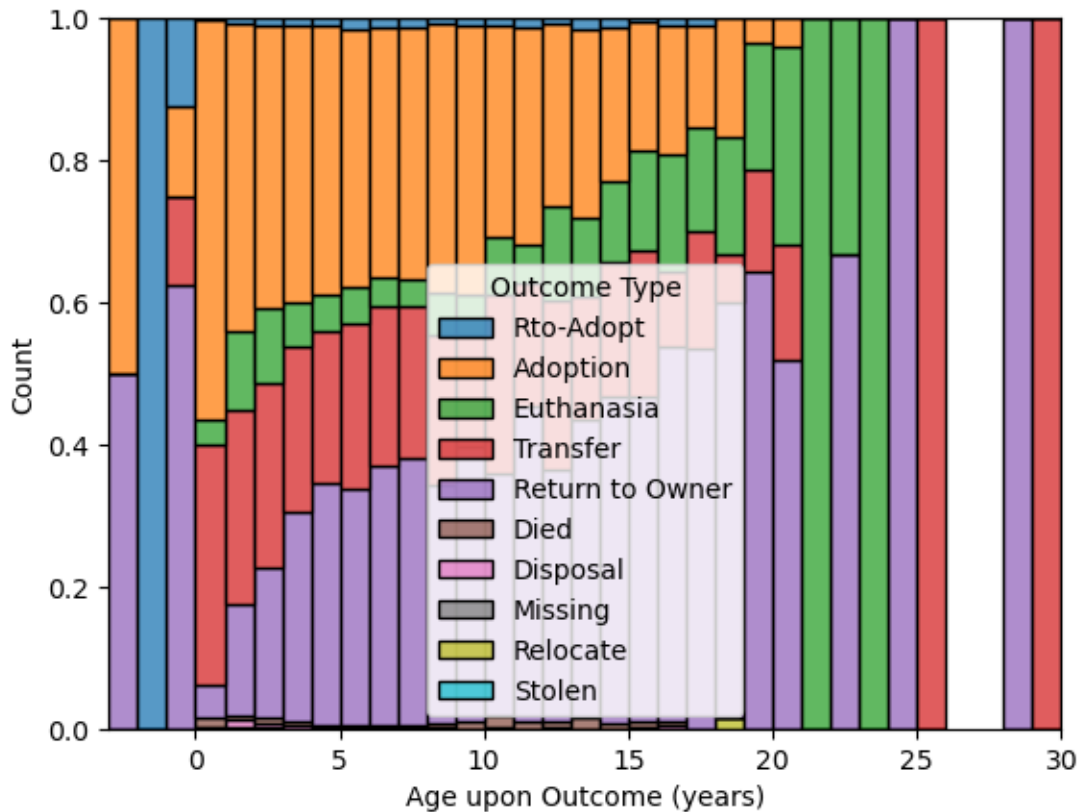
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```

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```
/home/isaac/miniconda3/envs/cse3380/lib/python3.10/site-
packages/seaborn/distributions.py:499: FutureWarning: In a future version, the
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pd.Index(edges, name="edges"),
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packages/seaborn/distributions.py:500: FutureWarning: In a future version, the
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```

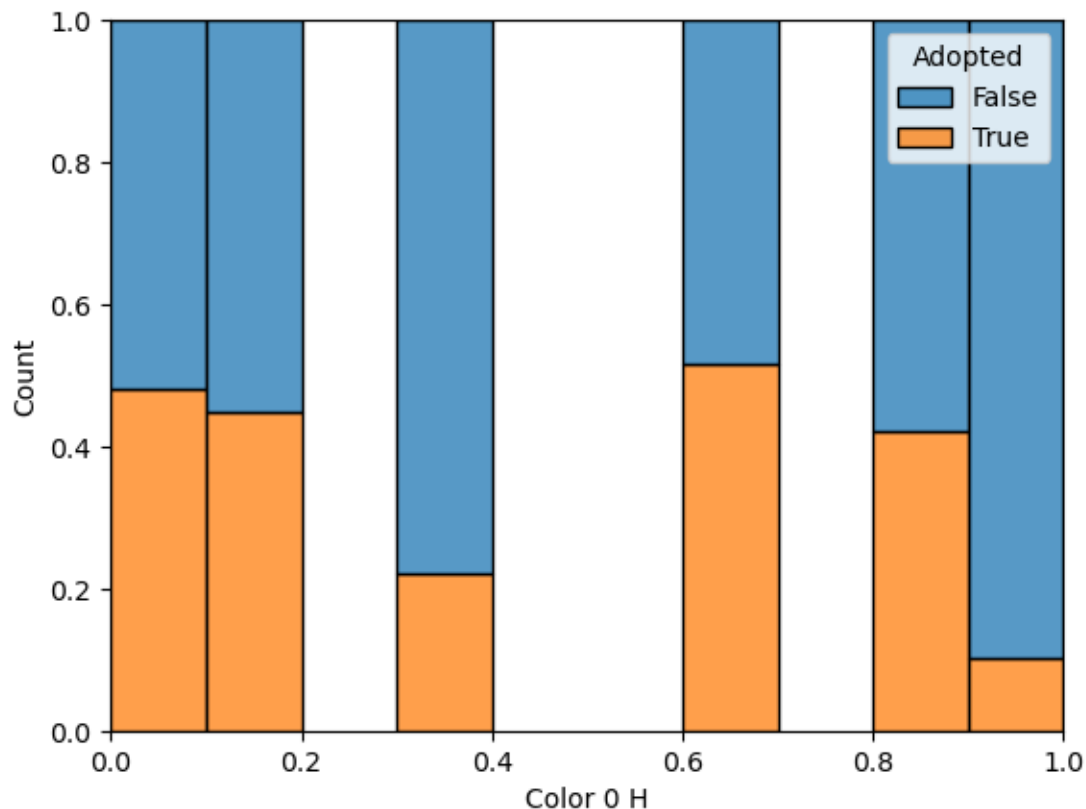
```
pd.Index(widths, name="widths"),
```

```
/home/isaac/miniconda3/envs/cse3380/lib/python3.10/site-
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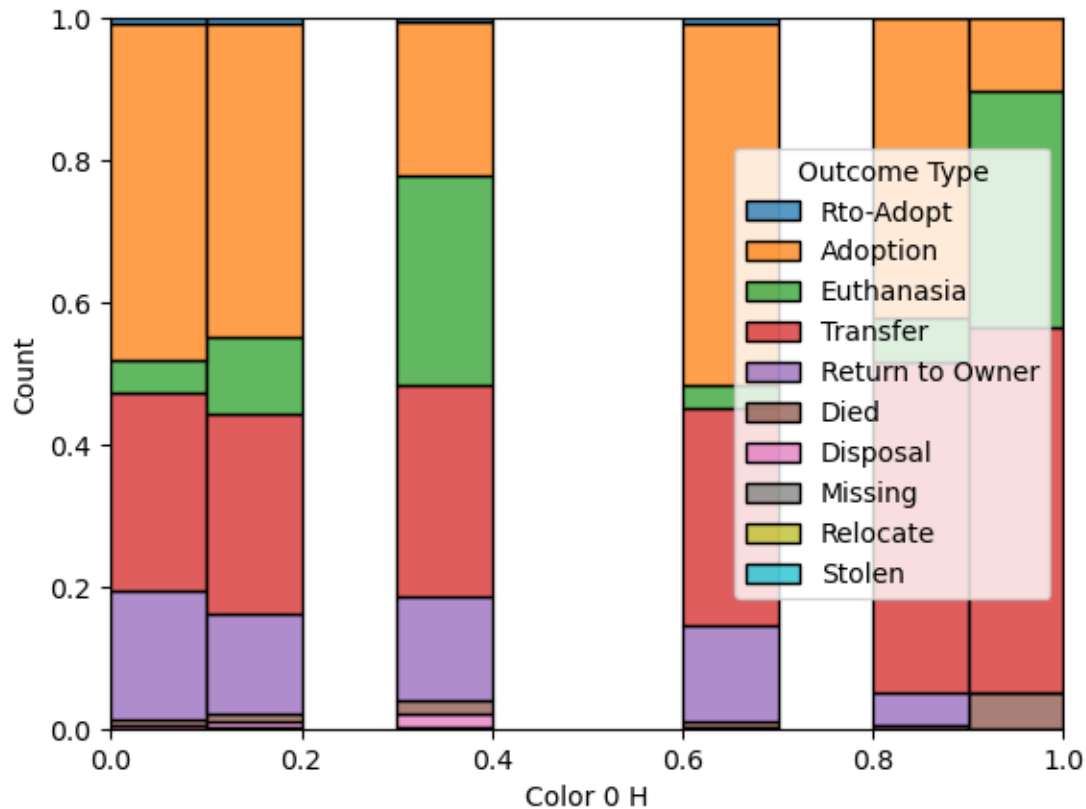
```
pd.Index(widths, name="widths"),
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```

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    pd.Index(widths, name="widths"),
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```

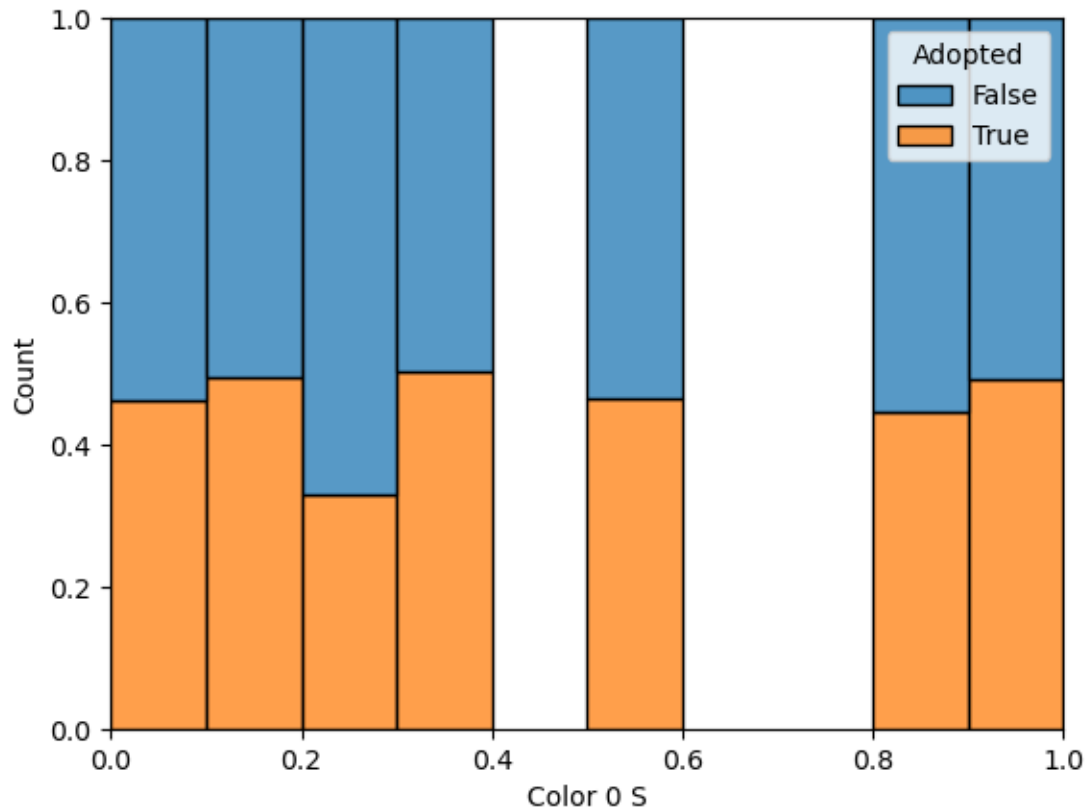
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/home/isaac/miniconda3/envs/cse3380/lib/python3.10/site-
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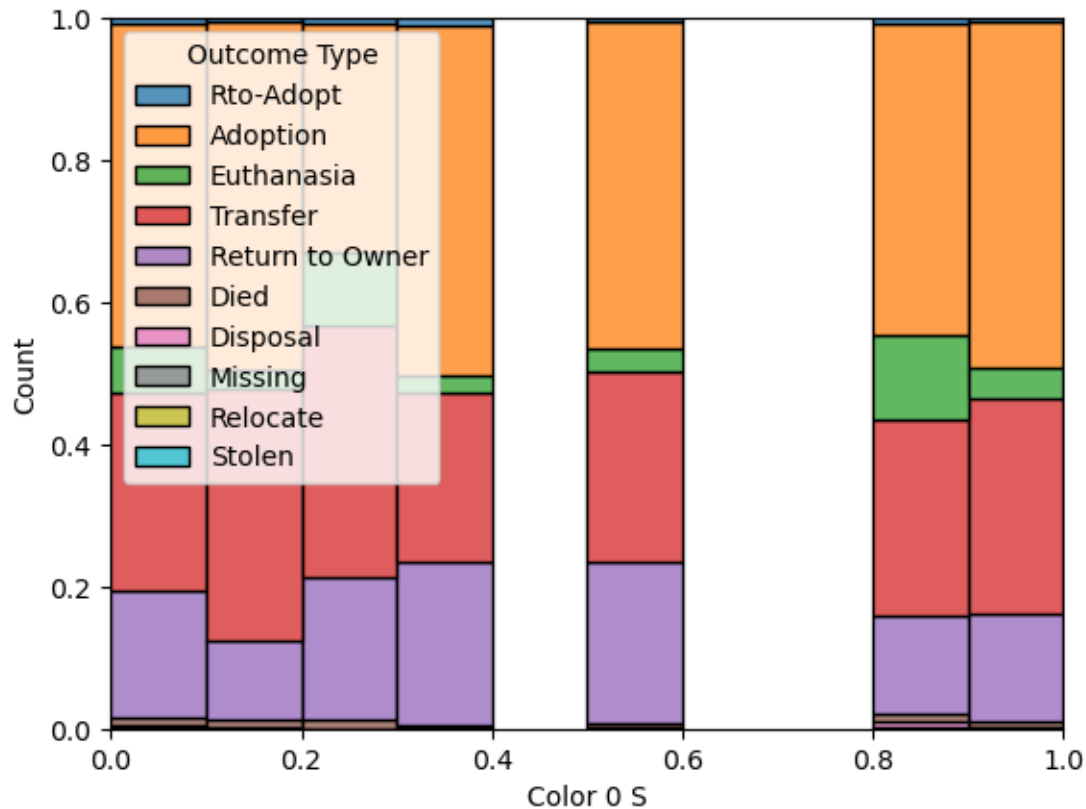
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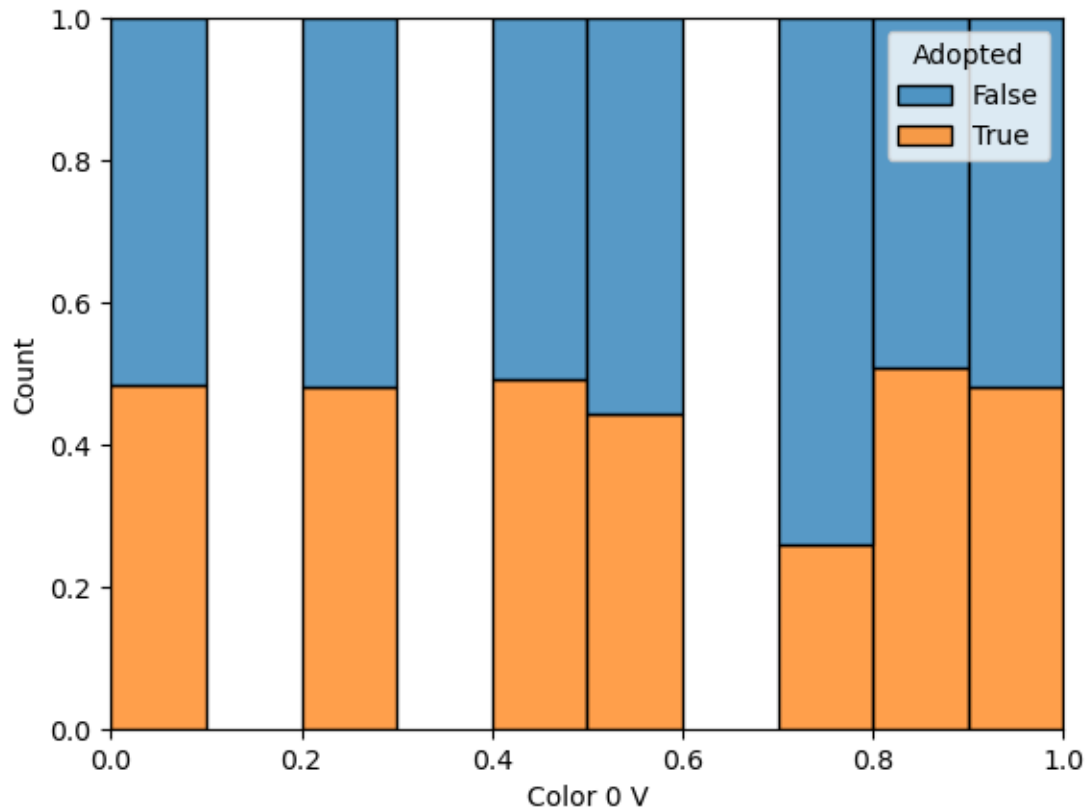
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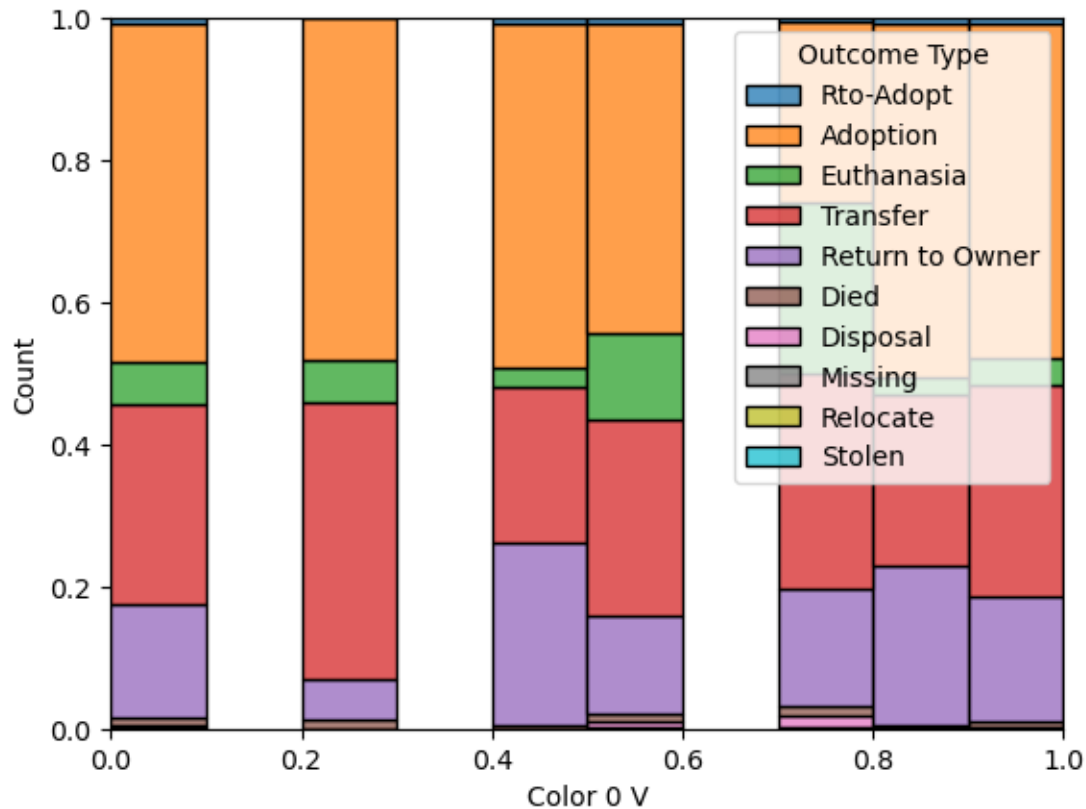
```
pd.Index(widths, name="widths"),
```



```

sequences (matching Series behavior)
    pd.Index(widths, name="widths"),
/home/isaac/miniconda3/envs/cse3380/lib/python3.10/site-
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```



3.3 Name

This section will attempt to look for correlations between the name of animals and their outcome.

```
[36]: # %pip install tensorflow
      # %pip install tensorflow_hub

      ## NOTE: when I ran this, it said:
      ## "Note: you may need to restart the kernel to use updated packages."
```

```
[37]: ## adapted from TensorFlow tutorial
      ## https://www.tensorflow.org/hub/tutorials/
      ↪ semantic_similarity_with_tf_hub_universal_encoder

      # import tensorflow as tf
      # import tensorflow_hub as hub
      # import os
      # import re

      # module_url = "https://tfhub.dev/google/universal-sentence-encoder/4"
      # model = hub.load(module_url)
```

```
# print ("module %s loaded" % module_url)
# def embed(input):
#     return model(input)
```

[]: