

# CKD\_EDA\_notebook

February 10, 2023

```
[304]: #DSC680 Project 1 CKD Prevalence and Awareness
#Christine Drosco 1/1/2023
'''
Data shows that Chronic Kidney Disease (CKD) is on the rise and affects 1 out of 3
↳adults with diabetes and 1 out of 5 adults with high blood pressure
(Chronic Kidney Disease (CKD) Surveillance System, n.d.-b). But CKD doesn't
↳seem to have the same kind of wide-spread attention as diabetes and high
↳blood pressure.

Study Objective:
Should CKD be included as a major leading cause of death?
What are the prevalence and awareness levels?
If any, what accounts for the disparities in the prevalence and awareness
↳levels?

'''
```

```
[304]: '\nData shows that Chronic Kidney Disease (CKD) is on the rise and affects 1 out
3 adults with diabetes and 1 out of 5 adults with high blood pressure\n(Chronic
Kidney Disease (CKD) Surveillance System, n.d.-b). But CKD doesn't seem to have
the same kind of wide-spread attention as diabetes and high blood
pressure.\n\nStudy Objective:\nShould CKD be included as a major leading cause
of death?\nIs the lack of dissemination due to lack of awareness of the disease
or the insufficient active monitoring of patients with high risk factors?\n\n'
```

```
[305]: import pandas as pd
```

```
[306]: # Graph the prevalence of CKD by State
# Import the Prevalence_of_CKD_by_US_State_and_County_by_County_2019.xlsx from
↳the CDC renamed to state_data.xlsx
```

```
[307]: df = pd.read_excel('state_data.xlsx', header=0)
```

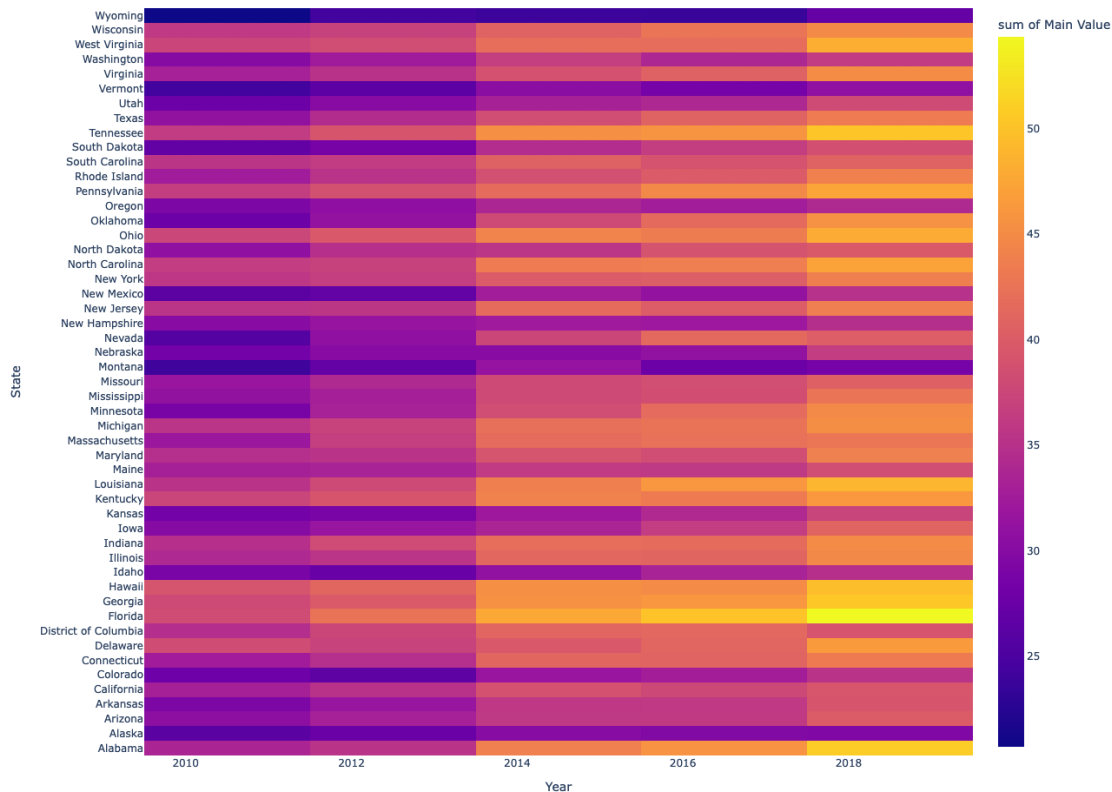
```
[308]: # Drop the rows where the year <=2009

df.drop(df.loc[df['Year']<= 2009].index, inplace=True)
```

```
[309]: #Need to aggregate the values for each county in each state and compute the mean
## Ckd prevalence by State per year (mean)
ckd_prev = df.groupby(['State', 'Year']).agg('Main Value').mean().reset_index()
```

```
[310]: # Ckd prevalence by State per year
fig=px.density_heatmap(data_frame=ckd_prev,
                        x='Year',
                        y='State',
                        z='Main Value',
                        height=1000,
                        width=900,
                        template='plotly_white')

fig.show()
```



```
[311]: # CKD Prevalence for all states from 2010-2019
```

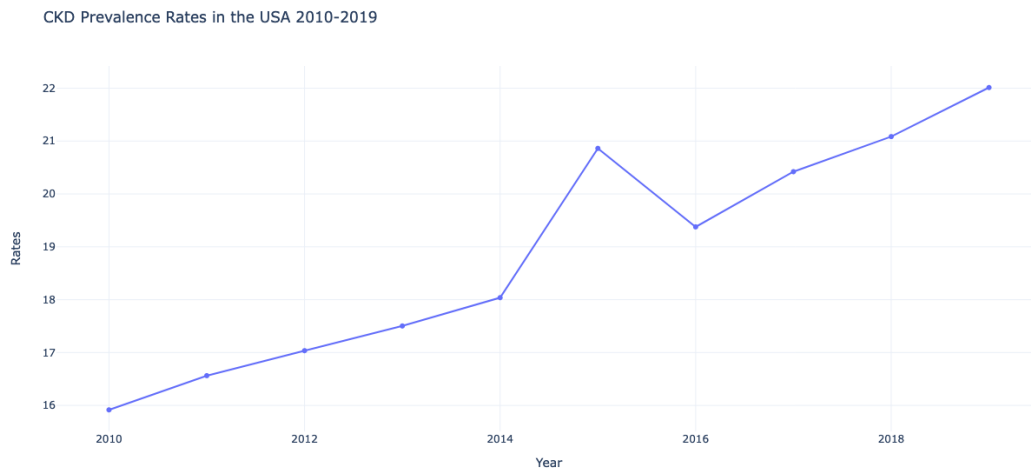
```
[312]: ckd_all = df.groupby(['Year']).agg('Main Value').mean().reset_index()
ckd_all
```

```
[312]:
```

	Year	Main Value
0	2010	15.92
1	2011	16.56
2	2012	17.04
3	2013	17.50
4	2014	18.04
5	2015	20.86
6	2016	19.38
7	2017	20.42
8	2018	21.08
9	2019	22.01

```
[313]: fig = px.line(ckd_all, x="Year", y="Main Value",
                    title='CKD Prevalence Rates in the USA 2010-2019',
                    template='plotly_white',
                    markers=True,
                    labels={'Main Value': 'Rates'},
                    height=600, width=1100)

fig.show()
```



```
[ ]: # Get death rates for ckd, heart disease and diabetes for comparison
      # Center for Disease Control -Stats by the States tables
```

```
[314]: hd = pd.read_csv('HD_death_rates_states.csv', header=0)
```

```
[315]: dd = pd.read_csv('DD_data_table.csv', header=0)
```

```

[316]: dd.drop(dd.loc[dd['YEAR']<= 2009].index, inplace=True)

[317]: # Create a subset to display latest year's data via choropleth map

[318]: hd.drop(hd.loc[hd['YEAR']<= 2009].index, inplace=True)

[319]: ckd = pd.read_csv('ckd_deaths.csv', header=0)

[320]: ckd.drop(ckd.loc[ckd['YEAR']<= 2009].index, inplace=True)

[321]: import plotly.express as px
import plotly.graph_objects as go

[322]: # Create a subset to display latest year's data via choropleth map

[323]: subset = ckd.loc[ckd['YEAR'] == 2020]

[324]: subset2 = hd.loc[hd['YEAR'] == 2020]

[325]: subset3 = dd.loc[dd['YEAR'] == 2020]

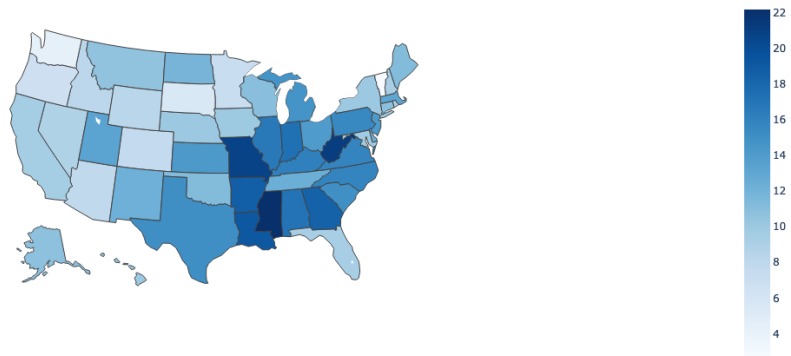
[326]: fig = go.Figure(data=go.Choropleth(
    locations=subset["STATE"], # DataFrame column with
    ↪locations
    z=subset["RATE"], # DataFrame column with color value
    colorscale = "Blues",
    locationmode = 'USA-states')) # Set to plot as US States

fig.update_layout(
    title_text = '2020 CKD Death Rate by State',
    geo_scope='usa', # limit map scope to USA
    width=900, height=600)

fig.show() # Output the plot to the screen

```

2020 CKD Death Rate by State



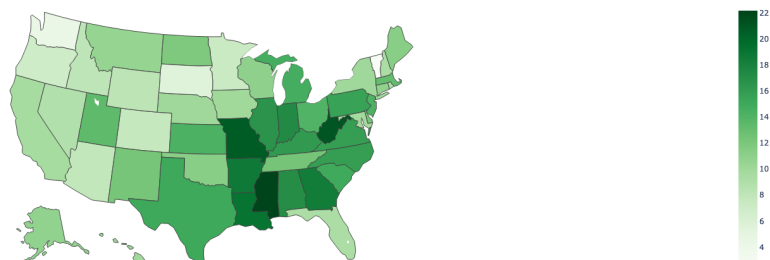
[ ]:

```
[327]: fig = go.Figure(data=go.Choropleth(
    locations=subset2["STATE"], # DataFrame column with
    ↪ locations
    z=subset["RATE"], # DataFrame column with color value
    colorscale = "Greens",
    locationmode = 'USA-states')) # Set to plot as US States

fig.update_layout(
    title_text = '2020 Heart Disease Death Rate by State',
    geo_scope='usa', # limit map scope to USA
    width=900, height=600)

fig.show() # Output the plot to the screen
```

2020 Heart Disease Death Rate by State



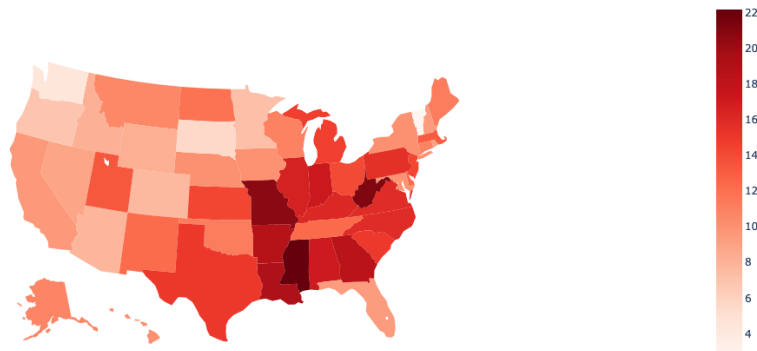
```
[328]: fig = go.Figure(data=go.Choropleth(
    locations=subset["STATE"], # DataFrame column with
    ↪ locations
    z=subset["RATE"], # DataFrame column with color value
    colorscale = "Reds",

    marker_line_width=0,
    locationmode='USA-states'))
    # Set to plot as US States

fig.update_layout(
    title_text = '2020 Diabetes Disease Death Rate by State',
    geo_scope='usa', # limit map scope to USA
    width=900, height=600)

fig.show() # Output the plot to the screen
```

2020 Diabetes Disease Death Rate by State



```
[329]: # group df by year, total the rate value and compute the mean

def groupby_year(df):
    disp = df.groupby(['YEAR']).agg('RATE').mean().reset_index(name='Mean')
    return (disp)

[330]: ckd_disp = groupby_year(ckd)
    hd_disp = groupby_year(hd)
```

```
dd_disp = groupby_year(dd)
```

```
[381]: # Create combined data frame
#ckd_disp['Disease'] = "CKD"
#dd_disp['Disease'] = "Diabetes"
hd_disp['Disease'] = "Heart Disease"
```

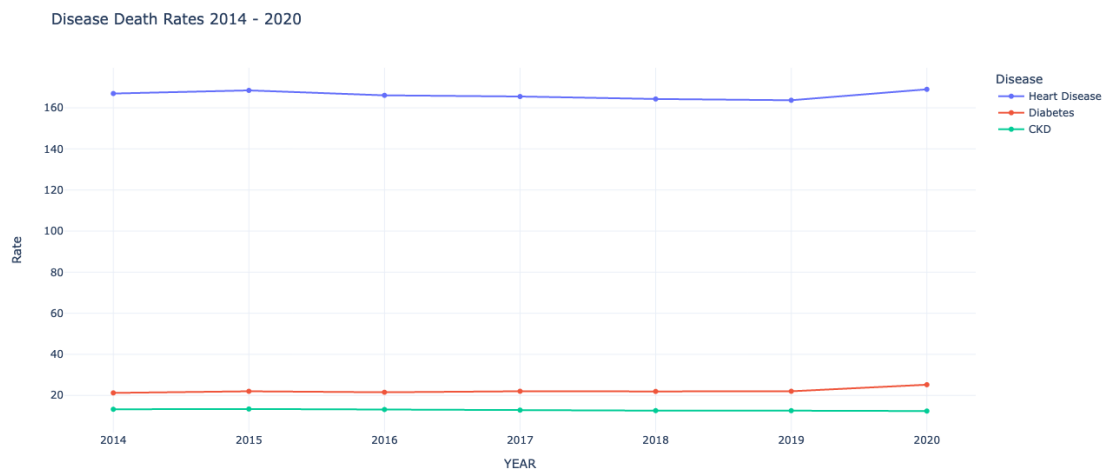
```
[382]: combo = [hd_disp, dd_disp, ckd_disp]
```

```
[383]: # Concat dataframes
new_df = pd.concat(combo, axis=0)
```

```
[384]: # Display Death rates by Year

fig = px.line(new_df, x="YEAR", y="Mean",
               title='Disease Death Rates 2014 - 2020',
               template='plotly_white',
               markers=True,
               color='Disease',
               labels={'Mean': 'Rate'},
               height=600, width=1100)

fig.show()
```



```
[259]: # Nhanes characteristics (prevalence)
import os
import pandas as pd
```

```
os.getcwd()
```

```
[259]: '/Users/corosco/DSC680/Project 1'
```

```
[92]: #pd.reset_option('display.float_format')
```

```
[ ]: #Read in the NHANES file to capture demographics data
```

```
[332]: nhanes = pd.read_excel('nhanes_chars.xlsx', header=0)
```

```
[333]: pd.set_option('display.float_format', lambda x: '%0.0f' % x)
```

```
[334]: subset = nhanes.iloc[1:,0:]
```

```
[335]: subset.rename(columns={'category':'Category'}, inplace = True)
subset
```

```
[335]:
```

	attribute	2017-Mar. 2020	2013-2016	2009-2012	\
1	20-44 years	44	45	46	
2	45-54 years	16	18	19	
3	55-64 years	19	17	17	
4	65-74 years	13	12	10	
5	75+ years	8	8	7	
6	Female	52	52	52	
7	Male	48	48	48	
8	White	63	65	67	
9	Black	11	11	11	
10	Hispanic	16	15	14	
11	Other	10	9	7	
12	Diabetes	13	12	10	
13	Self-reported diabetes	12	11	9	
14	Hypertension	50	46	46	
15	Self-reported hypertension	33	34	31	
16	Cardiovascular disease	8	7	7	
17	Obesity	42	39	35	

	2005-2008	Category
1	48	age
2	22	age
3	14	age
4	9	age
5	8	age
6	52	sex
7	48	sex
8	71	ethnicity
9	11	ethnicity
10	12	ethnicity



```

11         6 ethnicity
12         9 health
13         8 health
14        46 health
15        30 health
16         7 health
17        34 health

```

```

[336]: # Compute the delta from 2009 till 2020 for all characteristics
subset['Delta'] = subset['2017-Mar. 2020'] - subset['2009-2012']

```

```

[337]: subset.rename(columns={'attribute':'Attribute'}, inplace = True)

```

```

[338]: #fig2 = px.bar(subset, x='2017-Mar. 2020', y='attribute', title='2017 - Mar
↳2020 Nhanes Characteristics',
#           width=600, height=600)

#fig2.update_layout(uniformtext_minsize=8, color='category',
↳uniformtext_mode='hide', autosize=False, title_x=0.7, title_font_family
↳="Calibri")

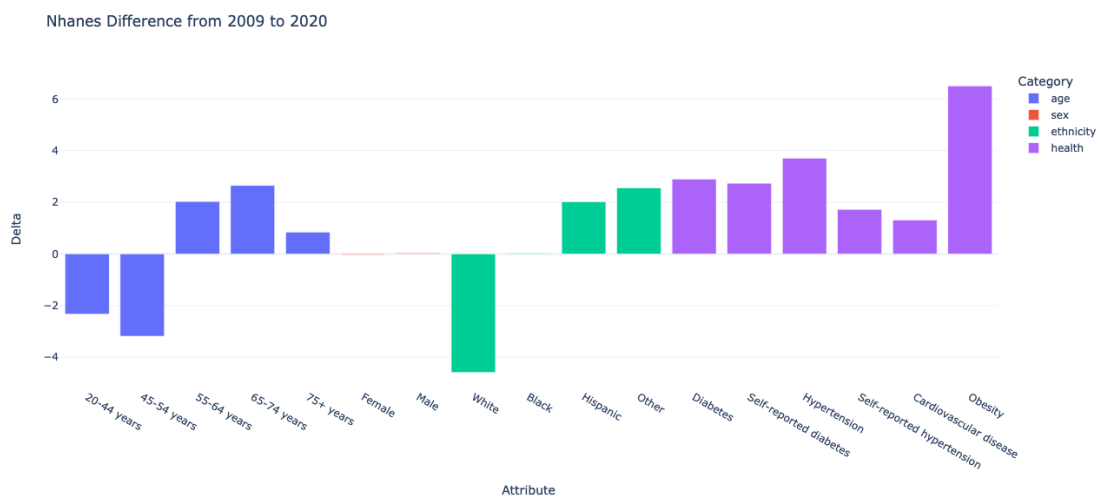
```

```

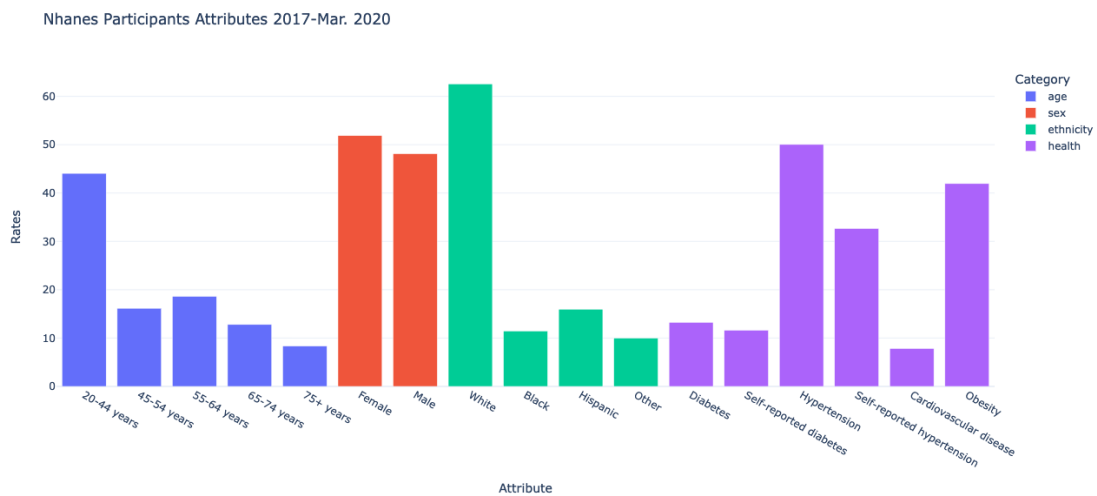
[339]: # Difference from 2009 to 2020

fig = px.bar(subset, x='Attribute', y='Delta',
             color='Category',
             template='plotly_white',
             title='Nhanes Difference from 2009 to 2020', height=600,
↳width=1000)
fig.show()

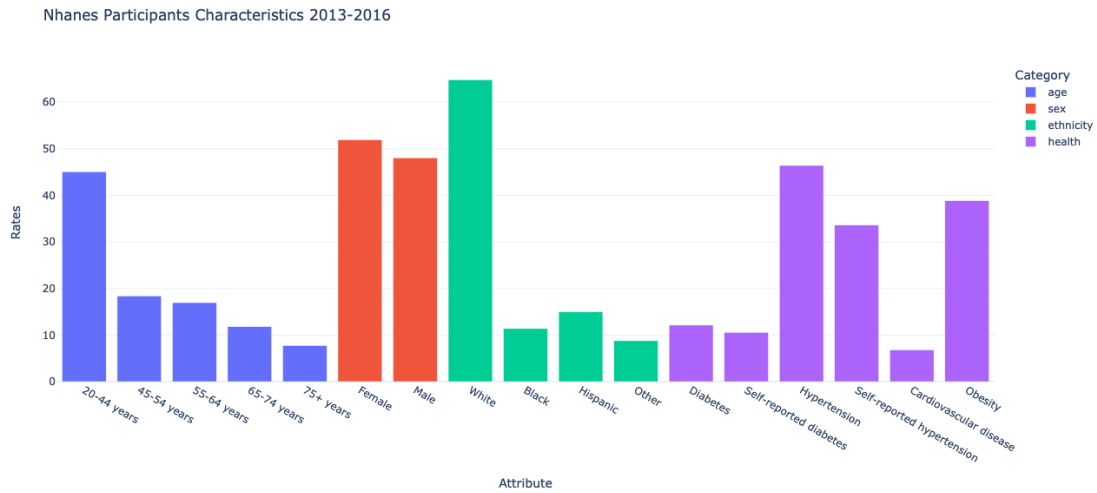
```



```
[340]: #2017 to 2020 values
fig = px.bar(subset, x='Attribute', y='2017-Mar. 2020',
             template='plotly_white', color='Category',
             title='Nhanes Participants Attributes 2017-Mar. 2020', height=600,
             width=1000,
             labels={'2017-Mar. 2020': 'Rates'})
fig.show()
```

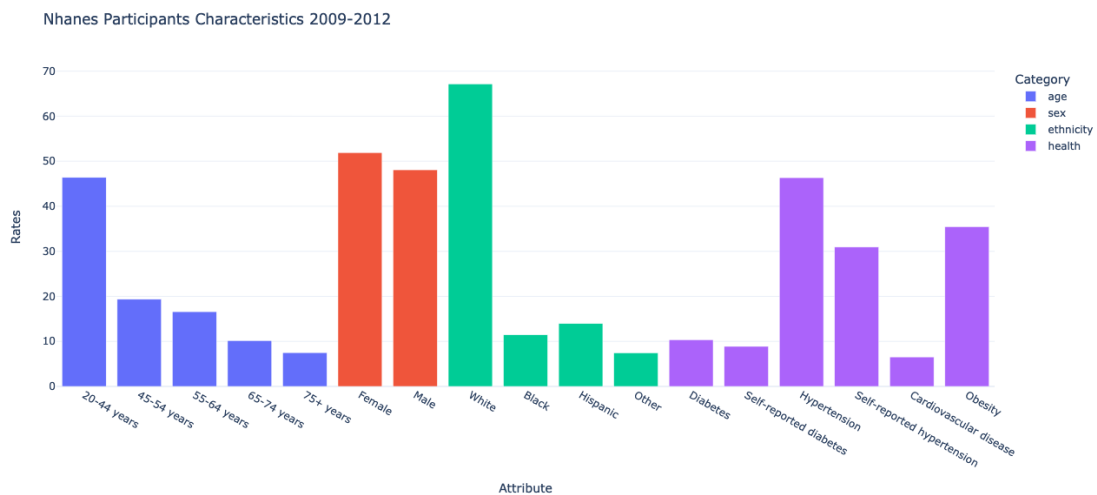


```
[341]: #2013-2016 values
fig = px.bar(subset, x='Attribute', y='2013-2016',
             template='plotly_white', color='Category',
             title='Nhanes Participants Characteristics 2013-2016', height=600,
             width=900,
             labels={'2013-2016': 'Rates'})
fig.show()
```



```
[342]: #2009-2012 values
fig = px.bar(subset, x='Attribute', y='2009-2012',
             template='plotly_white',
             hover_data=['2009-2012'], color='Category',
             labels={'2009-2012': 'Rates'},
             title='Nhanes Participants Characteristics 2009-2012', height=600,
             width=1000)

fig.show()
```



```
[343]: # Awareness of ckd by Year and Stage
```

```
ckd_aware = pd.read_excel('ckd_rates.xlsx', header=0)
```

```
[344]: ckd_aware.drop(ckd_aware.loc[ckd_aware['Year'] == "1999-2000"].index, inplace=True)
```

```
[345]: pd.set_option('display.float_format', lambda x: '%0.2f' % x)
```

```
[368]: ckd_aware.head(10)
```

```
[368]:
```

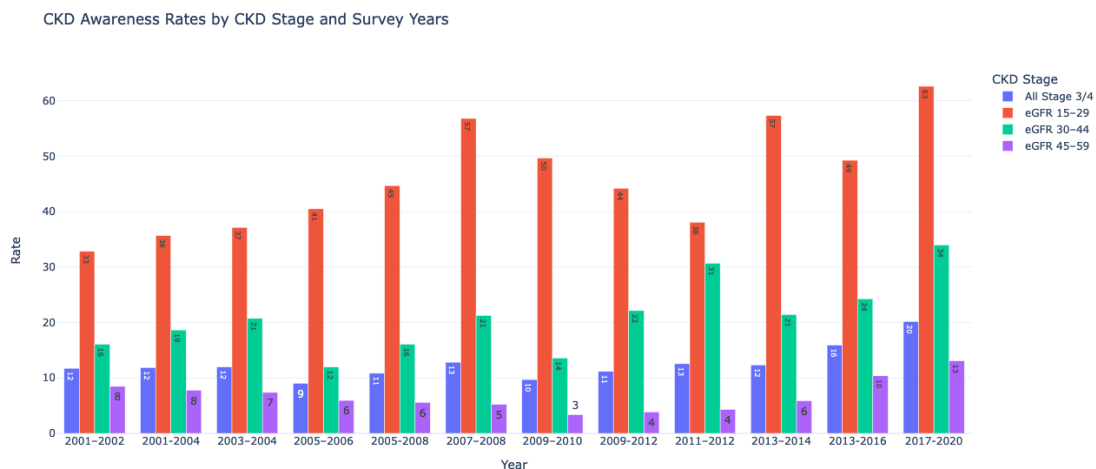
	Rate	Year	CKD Stage
4	11.74	2001-2002	All Stage 3/4
5	32.84	2001-2002	eGFR 15-29
6	16.08	2001-2002	eGFR 30-44
7	8.48	2001-2002	eGFR 45-59
8	11.87	2001-2004	All Stage 3/4
9	35.68	2001-2004	eGFR 15-29
10	18.65	2001-2004	eGFR 30-44
11	7.80	2001-2004	eGFR 45-59
12	11.98	2003-2004	All Stage 3/4
13	37.15	2003-2004	eGFR 15-29

```
[346]: #Plot ckd_aware https://nccd.cdc.gov/ckd/detail.aspx?Qnum=Q98 Centers for
      ↪ Disease Control and Prevention.
      # Chronic Kidney Disease Surveillance System-United States. website. http://www.
      ↪ cdc.gov/ckd
      #The National Health and Nutrition Examination Survey (NHANES) is a nationally
      ↪ representative,
      # cross-sectional survey that is currently conducted every 2 years by the
      ↪ Centers for Disease Control
      # and Prevention's National Center for Health Statistics to examine disease
      ↪ prevalence
      # and trends over time in noninstitutionalized U.S. civilian residents.

ckd_aware.rename(columns={'Main Value':'Rate'}, inplace = True)

title1 = "$\\text{CKD Awareness All Stages} ^ {x}$"
fig = px.bar(ckd_aware, x='Year',
             #text_auto='.0f',
             y='Rate',
             color='CKD Stage',
             text_auto='.0f',
             template='plotly_white',
             title='CKD Awareness Rates by CKD Stage and Survey Years',
             height=600, width=1100,
             barmode='group')
```

```
fig.show()
```



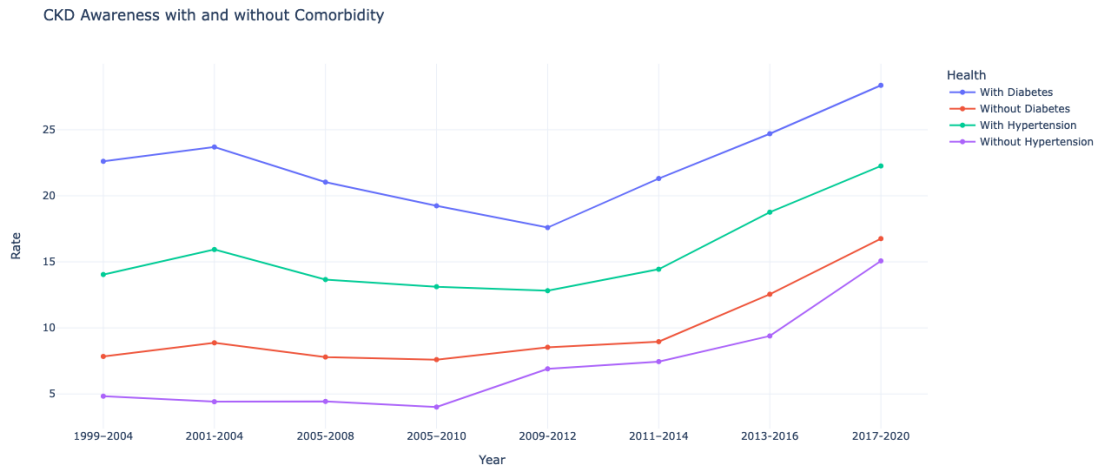
```
[347]: # CKD Awareness and Comorbidity
# https://nccd.cdc.gov/CKD/detail.aspx?Qnum=Q98&Strat=Year%2c+Diabetes
#awareness_of_CKD_Among_US_Adults_with_CKD_3_or_4 with and without Diabetes and
↳Hypotension
#Percentage with CKD Stage 3 or 4 Who Were Aware of Their Disease
#Centers for Disease Control and Prevention. Chronic Kidney Disease
↳Surveillance System-United States. website. http://www.cdc.gov/ckd

dh_aware = pd.read_excel('dd_aware.xlsx', header=0)
```

```
[348]: dh_aware.rename(columns={'Main Value':'Rate'}, inplace = True)
```

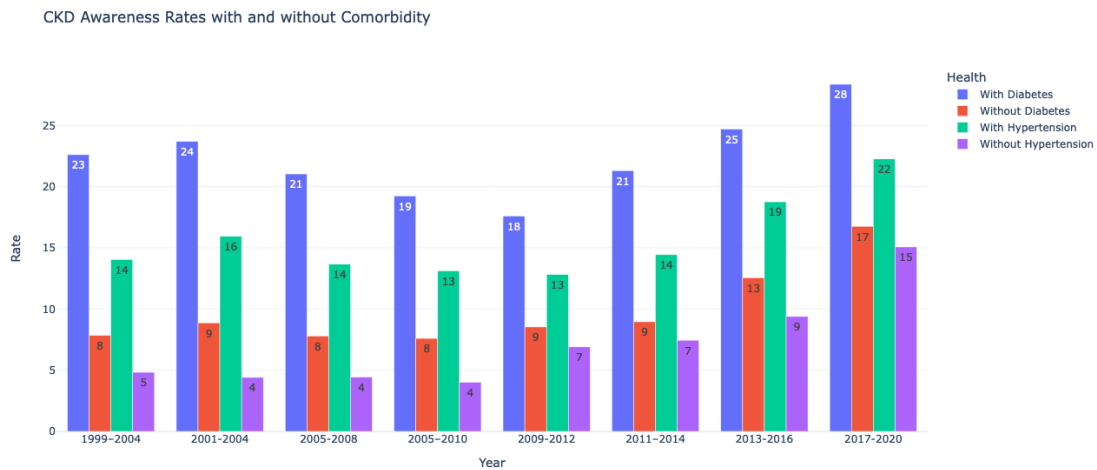
```
[349]: fig = px.line(dh_aware, x="Year", y="Rate",
                    title='CKD Awareness with and without Comorbidity',
                    color='Health',
                    template='plotly_white',
                    markers=True,
                    height=600, width=1100)
```

```
fig.show()
```



```
[350]: fig = px.bar(dh_aware, x='Year',
                    text_auto='.0f',
                    y='Rate',
                    color='Health',
                    template='plotly_white',
                    title = 'CKD Awareness Rates with and without Comorbidity',
                    height=600, width=1000,
                    barmode='group')
```

```
fig.show()
```



```
[351]: #Ckd prevalence by Stage
ckd_prev = pd.read_excel('ckd_prev.xlsx', header=0)

[352]: ckd_prev.drop(ckd_prev.loc[ckd_prev['Year'] <= '1999'].index, inplace=True)

fig = px.bar(ckd_prev, x='Year', text_auto='0f', y='Main Value', color='CKD Stage', template='plotly_white', title='CKD Prevalence Rates', height=600, width=1000, barmode='group', labels={'Main Value': 'Rate'})

fig.show()

[355]: #ckd comorbidity
# Comorbidity in chronic kidney disease: a large cross-sectional study of
# prevalence in Scottish primary care
'''
MacRae, C., Mercer, S. W., Guthrie, B., & Henderson, D. (2021).
Comorbidity in chronic kidney disease: a large cross-sectional
study of prevalence in Scottish primary care. The British journal
of general practice : the journal of the Royal College of
General Practitioners, 71(704), e243-e249. https://doi.org/10.3399/bjgp20X714125

Cross-sectional analysis of a primary care dataset representing 1 274 374
adults in Scotland.
This study was a secondary analysis of general practice electronic medical
record data using binary logistic
regression models adjusted for age, sex, and socioeconomic status. Data of
adults aged 25 years and 40 long-term conditions were used.
'''

[355]: '\nMacRae, C., Mercer, S. W., Guthrie, B., & Henderson, D. (2021). \nComorbidity
in chronic kidney disease: a large cross-sectional \nstudy of prevalence in
Scottish primary care. The British journal \nof general practice : the journal
of the Royal College of \nGeneral Practitioners, 71(704), e243-e249.
https://doi.org/10.3399/bjgp20X714125\n\n\n\nCross-sectional analysis of a
primary care dataset representing 1 274 374 adults in Scotland.\nThis study was
a secondary analysis of general practice electronic medical record data using
binary logistic \nregression models adjusted for age, sex, and socioeconomic
status. Data of adults aged 25 years and 40 long-term conditions were used.\n'

[356]: # Create dataset from report table
data = {'Age_group': ['25-34', '35-44', '45-54', '55-64', '65-74', '75-84',
    '85-plus'],
        'CKD_Rate': [0.3, 1.3, 3.1, 10.5, 27.2, 39.4, 18.1],
        'No_CKD': [18.5, 22.5, 20.4, 17.4, 11.8, 6.9, 2.5]}
```

```
s_ckd = pd.DataFrame(data)
```

```
[357]: s_ckd
```

```
[357]:
```

	Age_group	CKD_Rate	No_CKD
0	25-34	0.30	18.50
1	35-44	1.30	22.50
2	45-54	3.10	20.40
3	55-64	10.50	17.40
4	65-74	27.20	11.80
5	75-84	39.40	6.90
6	85-plus	18.10	2.50

```
[358]: '''
Markedly higher levels of comorbidity were found in people with CKD
compared with controls (98.2% versus 51.8%)
in both unadjusted analysis and age-, sex-, and deprivation-adjusted
comparisons. Strikingly, only 1.8% of people with CKD had no comorbidities,
↳compared with 48.2% in the control group (Table 2).

'''
data2 = {'Comorbid_group':['0', '1', '2-3', '4-6', '7-plus'],
         'CKD_Comorbid_Rate':[2.4, 13.0, 42.1, 36.0, 6.6],
         'No_CKD_Comorbid_Rate':[53.9, 22.2, 17.8, 5.6, 0.5]}
phy_ckd = pd.DataFrame(data2)
phy_ckd
```

```
[358]:
```

	Comorbid_group	CKD_Comorbid_Rate	No_CKD_Comorbid_Rate
0	0	2.40	53.90
1	1	13.00	22.20
2	2-3	42.10	17.80
3	4-6	36.00	5.60
4	7-plus	6.60	0.50

```
[359]: # Trends in referral patterns to nephrology for patients with CKD
# Use study as a reference
'''
Canadian Study
Ghimire, A., Ye, F., Hemmelgarn, B., Zaidi, D., Jindal, K. K., Tonelli, M. A.,
↳Cooper, M., James, M. T., Khan, M.,
Tinwala, M. M., Sultana, N., Ronksley, P. E., Muneer, S., Klarenbach, S.,
↳Okpechi, I. G., & Bello, A. K. (2022).
Trends in nephrology referral patterns for patients with chronic kidney disease:
↳
Retrospective cohort study. PloS one, 17(8), e0272689. https://doi.org/10.1371/
↳journal.pone.0272689
'''
```



Retrospective cohort study of adults with 1 visits to a nephrologist from primary care with 1 serum creatinine and/or urine protein measurement <180 days before index nephrology visit, from 2006 and 2019 in Alberta, Canada. Guideline discordant referrals were those that did not meet 1 of:

- Estimated glomerular filtration rate (eGFR)  $\geq 30$  mL/min/1.73m<sup>2</sup>, persistent albuminuria (ACR  $\geq 300$  mg/g, PCR  $\geq 500$  mg/g, or Udp  $\geq 2+$ ), or progressive and persistent decline in eGFR until index nephrology visit ( $< 5$  mL/min/1.73m<sup>2</sup>).

Of 69,372 patients with CKD, 28,518 (41%) were referred in a guideline concordant manner.

The overall rate of first outpatient visits to nephrology increased from 2006 to 2019, although guideline discordant referrals showed a greater increase (trend 21.9 per million population/year, 95% confidence interval 4.3, 39.4) versus guideline concordant referrals (trend 12.4 per million population/year, 95% confidence interval 5.7, 19.0).

...

[359]: 'Canadian Study Ghimire, A., Ye, F., Hemmelgarn, B., Zaidi, D., Jindal, K. K., Tonelli, M. A., Cooper, M., James, M. T., Khan, M., Tinwala, M. M., Sultana, N., Ronksley, P. E., Muneer, S., Klarenbach, S., Okpechi, I. G., & Bello, A. K. (2022). Trends in nephrology referral patterns for patients with chronic kidney disease: Retrospective cohort study. PloS one, 17(8), e0272689. <https://doi.org/10.1371/journal.pone.0272689>

Retrospective cohort study of adults with 1 visits to a nephrologist from primary care with 1 serum creatinine and/or urine protein measurement <180 days before index nephrology visit, from 2006 and 2019 in Alberta, Canada. Guideline discordant referrals were those that did not meet 1 of:

- Estimated glomerular filtration rate (eGFR)  $\geq 30$  mL/min/1.73m<sup>2</sup>, persistent albuminuria (ACR  $\geq 300$  mg/g, PCR  $\geq 500$  mg/g, or Udp  $\geq 2+$ ), or progressive and persistent decline in eGFR until index nephrology visit ( $< 5$  mL/min/1.73m<sup>2</sup>).

Of 69,372 patients with CKD, 28,518 (41%) were referred in a guideline concordant manner.

The overall rate of first outpatient visits to nephrology increased from 2006 to 2019, although guideline discordant referrals showed a greater increase (trend 21.9 per million population/year, 95% confidence interval 4.3, 39.4) versus guideline concordant referrals (trend 12.4 per million population/year, 95% confidence interval 5.7, 19.0).

[360]: #EGFR values associated with CKD Stages

```
data = {'eGFR': ['90 and above', '60-89', '30-59', '15-29', '14 or less'],
        'CKD_Stage': [1,2,3,4,5]}
```

```
ckd = pd.DataFrame(data)
```

```
ckd
```

```
[360]:
```

	eGFR	CKD_Stage
0	90 and above	1
1	60-89	2
2	30-59	3
3	15-29	4
4	14 or less	5

```
[ ]:
```