Agenda Restructuring data pd.melt() pd.pivot() pd.pivot\_table() pd.cut() Dealing with Missing Values ■ None and nan values ✓ ■ isna() and isnull() ✓ dropna() fillna() • String method in pandas Handling datetime Writing to a file Importing Dataset In [2]: import numpy as np import pandas as pd In [3]: df=pd.read\_csv("/Users/nikhilsanghi/Downloads/01\_dsml-course-main-live/batches/2\_Sept\_Beg\_Tue\_Oct\_Beg\_Tue/12\_Pandas\_5/Pfizer\_1.csv") 3:30:00 4:30:00 5:30:00 6:30:00 7:30:00 8:30:00 9:30:00 10:30:00 11:30:00 12:30:00 Out[3]: Date Drug\_Name Parameter 1:30:00 2:30:00 diltiazem hydrochloride 21 **0** 15-10-2020 23.0 22.0 21.0 21.0 22 23.0 21.0 22.0 20 20.0 Temperature NaN diltiazem hydrochloride 12.0 13.0 NaN 11.0 13.0 16.0 16.0 24.0 18 19.0 20 **1** 15-10-2020 Pressure 14 **2** 15-10-2020 docetaxel injection Temperature 17.0 18 NaN 23.0 23 25.0 25 NaN 17.0 18.0 NaN NaN **3** 15-10-2020 22.0 22.0 23 27.0 26 29.0 28 docetaxel injection Pressure NaN 22.0 NaN NaN NaN **4** 15-10-2020 ketamine hydrochloride 26 Temperature 24.0 NaN 27.0 NaN 25.0 23.0 22 21.0 20 NaN 24.0 9 10.0 10.0 9 9.0 11 **5** 15-10-2020 ketamine hydrochloride Pressure 8.0 NaN NaN 7.0 NaN 11.0 38 39.0 42 **6** 16-10-2020 diltiazem hydrochloride Temperature 34.0 35.0 36.0 36.0 37.0 37.0 38.0 40 NaN **7** 16-10-2020 diltiazem hydrochloride Pressure 18.0 19.0 20.0 21.0 22.0 23 24.0 25.0 25.0 24 NaN 27 49 58 **8** 16-10-2020 46.0 47.0 NaN 48.0 48.0 50.0 52.0 55.0 56 57.0 docetaxel injection Temperature 9 16-10-2020 23.0 NaN 25.0 26.0 27 28.0 29.0 28.0 28 29.0 30 docetaxel injection Pressure 24.0 **10** 16-10-2020 ketamine hydrochloride 10.0 12 12.0 NaN 13 14.0 15 Temperature 8.0 9.0 NaN 11.0 11.0 **11** 16-10-2020 ketamine hydrochloride 15 NaN 17.0 18 Pressure 12.0 12.0 13.0 NaN 15.0 15.0 15.0 16 **12** 17-10-2020 diltiazem hydrochloride 20.0 19.0 19.0 18.0 17.0 16 15.0 NaN 13.0 14 11.0 10 Temperature **13** 17-10-2020 diltiazem hydrochloride 4.0 8 13.0 14 Pressure 3.0 4.0 4.0 6.0 9.0 NaN 9.0 11 **14** 17-10-2020 17 docetaxel injection 12.0 13.0 14.0 15.0 16.0 18.0 19.0 20.0 21 22.0 23 Temperature **15** 17-10-2020 20.0 22.0 23 27.0 28 29.0 28 docetaxel injection Pressure 22.0 22.0 22.0 25.0 26.0 **16** 17-10-2020 ketamine hydrochloride Temperature 13.0 14.0 15.0 16.0 17.0 18 19.0 20.0 21.0 22 23.0 24 17 17-10-2020 ketamine hydrochloride Pressure 8.0 9.0 10.0 11.0 11.0 12 12.0 11.0 12.0 13 14.0 15 df.shape (18, 15) Out[4]: **Restructuring data** pd.melt() In [12]: pd.melt(df, id\_vars=["Date","Drug\_Name","Parameter"]) Date Parameter variable value Out[12]: Drug\_Name **0** 15-10-2020 diltiazem hydrochloride Temperature 1:30:00 **1** 15-10-2020 diltiazem hydrochloride Pressure 1:30:00 12.0 **2** 15-10-2020 docetaxel injection Temperature 1:30:00 NaN **3** 15-10-2020 docetaxel injection 1:30:00 Pressure NaN **4** 15-10-2020 ketamine hydrochloride Temperature 1:30:00 24.0 **211** 17-10-2020 diltiazem hydrochloride Pressure 12:30:00 14.0 **212** 17-10-2020 docetaxel injection Temperature 12:30:00 23.0 **213** 17-10-2020 docetaxel injection Pressure 12:30:00 **214** 17-10-2020 ketamine hydrochloride Temperature 12:30:00 24.0 **215** 17-10-2020 ketamine hydrochloride Pressure 12:30:00 15.0 216 rows × 5 columns In [13]: df\_melt=pd.melt(df, id\_vars=["Date","Drug\_Name","Parameter"], var\_name="Time", value\_name="Reading") df\_melt Out[13]: Date Drug\_Name Time Reading Parameter **0** 15-10-2020 diltiazem hydrochloride Temperature 1:30:00 23.0 1 15-10-2020 diltiazem hydrochloride Pressure 1:30:00 12.0 **2** 15-10-2020 docetaxel injection Temperature 1:30:00 NaN **3** 15-10-2020 docetaxel injection Pressure 1:30:00 NaN **4** 15-10-2020 ketamine hydrochloride Temperature 1:30:00 24.0 **211** 17-10-2020 diltiazem hydrochloride Pressure 12:30:00 14.0 **212** 17-10-2020 docetaxel injection Temperature 12:30:00 23.0 **213** 17-10-2020 docetaxel injection Pressure 12:30:00 28.0 **214** 17-10-2020 ketamine hydrochloride Temperature 12:30:00 24.0 **215** 17-10-2020 ketamine hydrochloride Pressure 12:30:00 15.0 216 rows × 5 columns pd.pivot() In [16]: df\_pivoted\_raw=pd.pivot(df\_melt, index=["Date", "Drug\_Name", "Time"], columns="Parameter", values="Reading") df\_pivoted\_raw Out[16]: Date Drug\_Name 10:30:00 20.0 15-10-2020 diltiazem hydrochloride 18.0 11:30:00 19.0 20.0 12:30:00 20.0 21.0 1:30:00 12.0 23.0 2:30:00 13.0 22.0 17-10-2020 ketamine hydrochloride 5:30:00 11.0 17.0 6:30:00 12.0 18.0 7:30:00 12.0 19.0 8:30:00 11.0 20.0 9:30:00 12.0 21.0 108 rows × 2 columns In [17]: df\_pivoted\_raw.index MultiIndex([('15-10-2020', 'diltiazem hydrochloride', '10:30:00'), 'diltiazem hydrochloride', '11:30:00'), '15-10-2020', 'diltiazem hydrochloride', '12:30:00'), ('15-10-2020', ('15-10-2020', '1:30:00'), 'diltiazem hydrochloride', ('15-10-2020', '2:30:00'), 'diltiazem hydrochloride', ('15-10-2020', 'diltiazem hydrochloride', '3:30:00'), '4:30:00'), ('15-10-2020', 'diltiazem hydrochloride', ('15-10-2020', 'diltiazem hydrochloride', '5:30:00'), ('15-10-2020', 'diltiazem hydrochloride', '6:30:00'), ('15-10-2020', 'diltiazem hydrochloride', '7:30:00'), ('17-10-2020', 'ketamine hydrochloride', '12:30:00'), '1:30:00'), ('17-10-2020', 'ketamine hydrochloride', ('17-10-2020', 'ketamine hydrochloride', '2:30:00'), '3:30:00'), 'ketamine hydrochloride', ('17-10-2020', 'ketamine hydrochloride', '4:30:00'), ('17-10-2020', ('17-10-2020', 'ketamine hydrochloride', '5:30:00'), '6:30:00'), ('17-10-2020', 'ketamine hydrochloride', '7:30:00'), ('17-10-2020', 'ketamine hydrochloride', ('17-10-2020', 'ketamine hydrochloride', '8:30:00'), ('17-10-2020', 'ketamine hydrochloride', '9:30:00')], names=['Date', 'Drug\_Name', 'Time'], length=108) In [18]: df\_pivot=df\_pivoted\_raw.reset\_index() df\_pivot Out[18]: Parameter Date Drug\_Name Time Pressure Temperature **0** 15-10-2020 diltiazem hydrochloride 10:30:00 18.0 20.0 **1** 15-10-2020 diltiazem hydrochloride 11:30:00 20.0 diltiazem hydrochloride 12:30:00 20.0 **2** 15-10-2020 21.0 **3** 15-10-2020 diltiazem hydrochloride 1:30:00 12.0 23.0 4 15-10-2020 diltiazem hydrochloride 2:30:00 13.0 22.0 **103** 17-10-2020 ketamine hydrochloride 5:30:00 17.0 11.0 **104** 17-10-2020 ketamine hydrochloride 12.0 18.0 **105** 17-10-2020 ketamine hydrochloride 7:30:00 19.0 12.0 **106** 17-10-2020 ketamine hydrochloride 11.0 20.0 **107** 17-10-2020 ketamine hydrochloride 9:30:00 12.0 21.0 108 rows × 5 columns In [22]: df\_pivot.columns Index(['Date', 'Drug\_Name', 'Time', 'Pressure', 'Temperature'], dtype='object', name='Parameter') Out[22]: In [24]: df\_pivot.columns.name=None In [25]: df\_pivot Date Time Pressure Temperature Out[25]: Drug\_Name **0** 15-10-2020 diltiazem hydrochloride 10:30:00 18.0 20.0 **1** 15-10-2020 diltiazem hydrochloride 11:30:00 19.0 20.0 **2** 15-10-2020 diltiazem hydrochloride 12:30:00 21.0 20.0 **3** 15-10-2020 diltiazem hydrochloride 23.0 1:30:00 12.0 2:30:00 22.0 **4** 15-10-2020 diltiazem hydrochloride 13.0 **103** 17-10-2020 ketamine hydrochloride 5:30:00 11.0 17.0 **104** 17-10-2020 ketamine hydrochloride 6:30:00 12.0 18.0 7:30:00 **105** 17-10-2020 ketamine hydrochloride 12.0 19.0 **106** 17-10-2020 ketamine hydrochloride 8:30:00 11.0 20.0 **107** 17-10-2020 ketamine hydrochloride 9:30:00 12.0 21.0 108 rows × 5 columns In [28]: df\_pivot.index.name In [29]: df["Date"] 15-10-2020 Out[29]: 15-10-2020 15-10-2020 15-10-2020 15-10-2020 15-10-2020 16-10-2020 16-10-2020 8 16-10-2020 16-10-2020 9 10 16-10-2020 11 16-10-2020 12 17-10-2020 13 17-10-2020 14 17-10-2020 15 17-10-2020 16 17-10-2020 17 17-10-2020 Name: Date, dtype: object In [ ]: pd.pivot\_table() In [30]: pd.pivot\_table(df\_pivot, index="Drug\_Name", columns="Date", values="Temperature") Date 15-10-2020 16-10-2020 17-10-2020 Out[30]: Drug\_Name diltiazem hydrochloride 21.454545 37.454545 15.636364 **docetaxel injection** 20.750000 51.454545 17.500000 **ketamine hydrochloride** 23.555556 11.500000 18.500000 In [32]: pd.pivot\_table(df\_pivot, index="Date", columns="Drug\_Name", values="Temperature") Drug\_Name diltiazem hydrochloride docetaxel injection ketamine hydrochloride 15-10-2020 21.454545 20.750000 23.555556 37.454545 11.500000 16-10-2020 51.454545 17-10-2020 15.636364 17.500000 18.500000 In [33]: pd.pivot\_table(df\_pivot, index="Drug\_Name", columns="Date", values=["Temperature", "Pressure"]) Out[33]: **Pressure** Temperature Date 15-10-2020 16-10-2020 17-10-2020 15-10-2020 16-10-2020 17-10-2020 Drug\_Name diltiazem hydrochloride 16.000000 22.545455 7.727273 21.454545 37.454545 15.636364 **docetaxel injection** 24.875000 27.000000 24.500000 20.750000 51.454545 17.500000 ketamine hydrochloride 9.333333 14.800000 11.500000 23.555556 11.500000 18.500000 In [34]: pd.pivot\_table(df\_pivot, index="Drug\_Name", columns="Date", values=["Temperature", "Pressure"], aggfunc="max") Out[34]: Temperature Pressure Date 15-10-2020 16-10-2020 17-10-2020 15-10-2020 16-10-2020 17-10-2020 Drug\_Name diltiazem hydrochloride 24.0 27.0 14.0 23.0 42.0 20.0 docetaxel injection 30.0 29.0 25.0 58.0 23.0 29.0 ketamine hydrochloride 11.0 18.0 15.0 27.0 15.0 24.0 In [35]: pd.pivot\_table(df\_pivot, index="Drug\_Name", columns="Date", values=["Temperature", "Pressure"], aggfunc=["max", "min"]) Out[35]: max min **Pressure** Temperature **Pressure** Temperature Date 15-10-2020 16-10-2020 17-10-2020 15-10-2020 16-10-2020 17-10-2020 15-10diltiazem hydrochloride 27.0 14.0 23.0 42.0 20.0 11.0 18.0 3.0 20.0 34.0 10.0 30.0 22.0 23.0 20.0 17.0 46.0 12.0 docetaxel injection 29.0 29.0 25.0 58.0 23.0 ketamine hydrochloride 11.0 18.0 15.0 27.0 15.0 24.0 7.0 12.0 8.0 20.0 8.0 13.0 In [36]: pd.pivot\_table(df\_pivot, index="Drug\_Name", columns="Date", values="Temperature", aggfunc="max", margins=True) Date 15-10-2020 16-10-2020 17-10-2020 Out[36]: Drug\_Name diltiazem hydrochloride 23.0 42.0 20.0 42.0 23.0 58.0 docetaxel injection 58.0 ketamine hydrochloride 27.0 15.0 24.0 27.0 27.0 58.0 24.0 58.0 In [ ]: In [ ]: pd.cut() In [ ]: **Dealing with Missing Values** In [37]: None In [38]: type(None) NoneType Out[38]: In [39]: np.nan Out[39]: In [40]: type(np.nan) float Out[40]: In [41]: pd.Series([1,np.nan,None]) 1.0 Out[41]: NaN NaN dtype: float64 pd.Series([1,2.0,np.nan,None]) Out[42]: 2 NaN 3 NaN dtype: float64 pd.Series(["1","2.0", np.nan, None]) 1 Out[43]: 2.0 2 NaN None dtype: object In [44]: pd.Series(["1", "2.0", "np.nan", None]) 1 Out[44]: 2.0 np.nan None dtype: object In [48]: df.isna().sum() Out[48]: Drug\_Name Parameter 1:30:00 2:30:00 3:30:00 4:30:00 5:30:00 6:30:00 7:30:00 8:30:00 9:30:00 10:30:00 0 11:30:00 12:30:00 dtype: int64 In [49]: df.isna().sum(axis=1) Out[49]: 1 4 3 4 3 3 8 9 10 11 12 13 14 15 16 17 dtype: int64 In [50]: df.isnull().sum() 0 Date Out[50]: Drug\_Name 0 Parameter 0 1:30:00 2 2:30:00 2 3:30:00 4:30:00 5:30:00 6:30:00 7:30:00 8:30:00 9:30:00 10:30:00 11:30:00 12:30:00 dtype: int64 In [51]: pd.isna <function pandas.core.dtypes.missing.isna(obj)> Out[51]: In [52]: pd.isnull <function pandas.core.dtypes.missing.isna(obj)> Out[52]: In [53]: df1=pd.DataFrame([[np.nan, 2, np.nan, 0], [3, 4, np.nan, 1], [np.nan, np.nan, np.nan], [np.nan, 3, np.nan, 4]], columns=["A", "B", "C", "D"]) df1 Out[53]: B C D **0** NaN 2.0 NaN 0.0 **1** 3.0 4.0 NaN 1.0 2 NaN NaN NaN NaN **3** NaN 3.0 NaN 4.0 df1["B"].mean() Out[55]: In [56]: df1["C"].mean() Out[56]: In [57]: df1["A"].mean() Out[57]: In [59]: df1 В С Out[59]: **0** NaN 2.0 NaN 0.0 **1** 3.0 4.0 NaN 1.0 2 NaN NaN NaN NaN **3** NaN 3.0 NaN 4.0 In [58]: df1.info() <class 'pandas.core.frame.DataFrame'> RangeIndex: 4 entries, 0 to 3 Data columns (total 4 columns): # Column Non-Null Count Dtype 0 1 non-null float64 float64 1 В 3 non-null 0 non-null 2 C float64 float64 3 D 3 non-null dtypes: float64(4) memory usage: 256.0 bytes In [60]: df1.fillna(0) Out[60]: A B C D **0** 0.0 2.0 0.0 0.0 **1** 3.0 4.0 0.0 1.0 **2** 0.0 0.0 0.0 0.0 **3** 0.0 3.0 0.0 4.0 In [61]: df1.fillna(100) Out[61]: **0** 100.0 2.0 100.0 0.0 **1** 3.0 4.0 100.0 1.0 **2** 100.0 100.0 100.0 100.0 **3** 100.0 3.0 100.0 4.0 In [62]: df1["A"].fillna(100) 100.0 Out[62]: 3.0 100.0 3 100.0 Name: A, dtype: float64 In [63]: Out[63]: A B C D **0** NaN 2.0 NaN 0.0 **1** 3.0 4.0 NaN 1.0 2 NaN NaN NaN NaN **3** NaN 3.0 NaN 4.0 In [64]: df1["D"].mean() 1.666666666666667 In [65]: df1["A"].fillna(df1["D"].mean()) 1.666667 Out[65]: 3.000000 2 1.666667 3 1.666667 Name: A, dtype: float64 In [67]: Out[67]: **0** NaN 2.0 NaN 0.0 **1** 3.0 4.0 NaN 1.0 2 NaN NaN NaN NaN **3** NaN 3.0 NaN 4.0 In [68]: df1.fillna(method="ffill") Out[68]: A B C D **0** NaN 2.0 NaN 0.0 **1** 3.0 4.0 NaN 1.0 **2** 3.0 4.0 NaN 1.0 **3** 3.0 3.0 NaN 4.0 In [70]: A B C D Out[70]: **0** NaN 2.0 NaN 0.0 **1** 3.0 4.0 NaN 1.0 2 NaN NaN NaN NaN **3** NaN 3.0 NaN 4.0 df1.fillna(method="bfill") Out[69]: A B C D **0** 3.0 2.0 NaN 0.0 **1** 3.0 4.0 NaN 1.0 2 NaN 3.0 NaN 4.0 3 NaN 3.0 NaN 4.0 In [72]: df1.interpolate() A B C D Out[72]: **0** NaN 2.0 NaN 0.0 **1** 3.0 4.0 NaN 1.0 2 3.0 3.5 NaN 2.5 **3** 3.0 3.0 NaN 4.0 df1["D"].fillna(df1["D"].mean()) 0.000000 Out[75]: 1 1.000000 2 1.666667 3 4.000000 Name: D, dtype: float64 In [78]: A B C D Out[78]: **0** NaN 2.0 NaN 0.0 **1** 3.0 4.0 NaN 1.0 2 NaN NaN NaN NaN **3** NaN 3.0 NaN 4.0 df1.dropna() Out[77]: **A B C D** df1.dropna(how="any") Out[79]: **A B C D** df1.dropna(how="all") A B C D Out[80]: **0** NaN 2.0 NaN 0.0 **1** 3.0 4.0 NaN 1.0 3 NaN 3.0 NaN 4.0 df1.dropna(how="all",axis=1) Out[82]: **0** NaN 2.0 0.0 **1** 3.0 4.0 1.0 2 NaN NaN NaN **3** NaN 3.0 4.0 In [85]: df1.dropna(thresh=3) Out[85]: A B C D **1** 3.0 4.0 NaN 1.0 In [86]: df1.dropna(thresh=2) A B C D **0** NaN 2.0 NaN 0.0 **1** 3.0 4.0 NaN 1.0 **3** NaN 3.0 NaN 4.0 In [89]: Out[89]: **0** NaN 2.0 NaN 0.0 **1** 3.0 4.0 NaN 1.0 2 NaN NaN NaN NaN **3** NaN 3.0 NaN 4.0 df1.dropna(thresh=2,axis=1) Out[87]: **0** 2.0 0.0 **1** 4.0 1.0 2 NaN NaN **3** 3.0 4.0 In [90]: df\_pivot.isna().sum() Date Out[90]: Drug\_Name Time 0 Pressure 13 Temperature dtype: int64 df\_pivot Out[91]: Drug\_Name Time Pressure Temperature **0** 15-10-2020 diltiazem hydrochloride 10:30:00 18.0 20.0 **1** 15-10-2020 diltiazem hydrochloride 11:30:00 20.0 19.0 **2** 15-10-2020 diltiazem hydrochloride 12:30:00 20.0 21.0 **3** 15-10-2020 diltiazem hydrochloride 1:30:00 23.0 12.0 22.0 **4** 15-10-2020 diltiazem hydrochloride 2:30:00 13.0 **103** 17-10-2020 ketamine hydrochloride 5:30:00 11.0 17.0 **104** 17-10-2020 ketamine hydrochloride 6:30:00 18.0 12.0 **105** 17-10-2020 ketamine hydrochloride 7:30:00 12.0 19.0 **106** 17-10-2020 ketamine hydrochloride 8:30:00 20.0 11.0 **107** 17-10-2020 ketamine hydrochloride 9:30:00 12.0 21.0 108 rows × 5 columns # Find way to replace values # Create dataframe groupby --> Date and DrugName **String method in pandas** In [ ]: **Handling datetime** In [ ]: In [ ]: In [ ]: Writing to a file **Doubts** In [ ]: def custom(x): x['tt'] = x['tt'] + 1return x['tt'] df.groupby(['M']).apply(custom)