SmallMoleculesEDA_Preprocessing_Submission

May 13, 2025

1 Small Molecules EDA and processing

```
[1]: import pandas as pd
     import numpy as np
     import matplotlib.pyplot as plt
     import seaborn as sns
[2]: from rdkit import Chem
     from rdkit.Chem import Draw
     from rdkit.Chem import AllChem
     from rdkit.Chem import DataStructs
     from rdkit.Chem import rdMolDescriptors
     from IPython.display import display, HTML
[3]: from rdkit.Chem import Descriptors
     from rdkit.Chem import MolFromSmiles
     from rdkit import Chem
     from rdkit.Chem import PandasTools
     PandasTools.RenderImagesInAllDataFrames(True)
     from rdkit import Chem
     from rdkit.Chem import Draw
[4]: from rdkit.Chem import Lipinski
     from rdkit.DataStructs import TanimotoSimilarity
[5]: import plotly.express as px
[6]: SmallMolecules = pd.read_csv("data/HarvardSmallMolecules.csv")
[7]: columns = ['Name', 'Molecular Mass', 'SMILES']
     drugs_EDA = SmallMolecules[columns]
[8]: PandasTools.AddMoleculeColumnToFrame(drugs_EDA, smilesCol='SMILES',_
      →molCol='structure')
```

/opt/anaconda3/lib/python3.12/site-packages/rdkit/Chem/PandasTools.py:376: SettingWithCopyWarning:

```
A value is trying to be set on a copy of a slice from a DataFrame. Try using .loc[row_indexer,col_indexer] = value instead
```

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy frame[molCol] = frame[smilesCol].map(Chem.MolFromSmiles)

```
[10]: descriptor_df = drugs_EDA["SMILES"].apply(compute_descriptors).apply(pd.Series) drugs_EDA = pd.concat([drugs_EDA, descriptor_df], axis=1)
```

```
[03:24:37] DEPRECATION WARNING: please use MorganGenerator
```

```
[03:24:37] DEPRECATION WARNING: please use MorganGenerator [03:24:37] DEPRECATION WARNING: please use MorganGenerator
```

[11]: drugs_EDA

[11]: Name Molecular Mass \ 0 AZD7762 362.12 1 Neratinib 556.20 2 487.16 Dasatinib 3 Saracatinib 541.21 4 Pictilisib 513.16 5 447.24 Palbociclib 6 Torin2 432.12 7 853.33 Taxol 8 Tivantinib 369.15 9 Trametinib 615.08 10 Olaparib 434.18 11 Buparlisib 410.17 12 Luminespib 465.23 13 TGX221 364.19 14 ABT-737 812.26 15 Cabozantinib 501.17 16 INK-128 309.13 17 Alpelisib 441.14 18 Everolimus 957.58 19 Cisplatin 298.96 20 Doxorubicin 543.17 21 Etoposide 588.18 22 Topotecan 421.16 23 Vorinostat 264.15 24 Dinaciclib 396.23 25 Ipatasertib 457.22 26 Volasertib 618.40 27 Abemaciclib 506.27 28 Ceritinib 557.22 29 PF-4708671 390.18 30 Cediranib 450.21 Taselisib 31 460.23

```
33
                             1414.52
        Bleomycin
                                                      SMILES \
0
    C1C[C@H](CNC1)NC(=0)C2=C(C=C(S2)C3=CC(=CC=C3)F...
1
    CCOC1=C(C=C2C(=C1)N=CC(=C2NC3=CC(=C(C=C3)OCC4=...
2
    CC1=C(C(=CC=C1)C1)NC(=0)C2=CN=C(S2)NC3=NC(=NC(...
3
    CN1CCN(CC1)CCOC2=CC(=C3C(=C2)N=CN=C3NC4=C(C=CC...
4
    CS(=0) (=0) N1CCN(CC1) CC2 = CC3 = C(S2) C(=NC(=N3) C4 = ...
5
    CC1=C(C(=0)N(C2=NC(=NC=C12)NC3=NC=C(C=C3)N4CCN...
6
    C1=CC(=CC(=C1)N2C(=0)C=CC3=CN=C4C=CC(=CC4=C32)...
7
    CC1=C2[C@H](C(=0)[C@@]3([C@H](C[C@@H]4[C@](C3[...
8
    C1CC2=CC=CC3=C2N(C1)C=C3[C@H]4[C@@H](C(=0)NC4=...
9
    CC1=C2C(=C(N(C1=0)C)NC3=C(C=C(C=C3)I)F)C(=0)N(...
    C1CC1C(=0)N2CCN(CC2)C(=0)C3=C(C=CC(=C3)CC4=NNC...
10
11
    C1COCCN1C2=NC(=NC(=C2)C3=CN=C(C=C3C(F)(F)F)N)N...
    CCNC(=0)C1=C(C(=C2C=C(C(=CC2=0)0)C(C)C)ON1)C3=...
12
13
    CC1=CN2C(=0)C=C(N=C2C(=C1)C(C)NC3=CC=CC=C3)N4C...
    {\tt CN(C)CC[C@H](CSC1=CC=CC=C1)NC2=C(C=C(C=C2)S(=0...))}
15
    \texttt{COC1=CC2=C}(\texttt{C=CN=C2C=C10C}) \, \texttt{OC3=CC=C}(\texttt{C=C3}) \, \texttt{NC}(\texttt{=0}) \, \texttt{C...}
    CC(C)N1C2=C(C(=N1)C3=CC4=C(C=C3)OC(=N4)N)C(=NC...
16
    CC1=C(SC(=N1)NC(=0)N2CCC[C@H]2C(=0)N)C3=CC(=NC...
17
18
    \texttt{CC1CCC2CC}(\texttt{C}(=\texttt{CC}=\texttt{CC}=\texttt{CC}(\texttt{CC}(\texttt{C}(=\texttt{O})\texttt{C}(\texttt{C}(=\texttt{CC}(\texttt{C}(=\texttt{O})\texttt{C}...
19
                                   N.N.[Cl-].[Cl-].[Pt+2]
20
    C[COH] 1[COH] ([COH] (C[COOH] (D1) 0[COH] 2C[COO] (CC...
21
    C[C@OH] 10C[C@OH] 2[C@OH] (01) [C@OH] ([COH] ([COOH] ...
    CC[C@@]1(C2=C(COC1=0)C(=0)N3CC4=C(C3=C2)N=C5C=...
22
23
                        C1=CC=C(C=C1)NC(=0)CCCCCCC(=0)NO
    \label{eq:cc1} \texttt{CCC1=C2N=C(C=C(N2N=C1)NCC3=C[N+](=CC=C3)[O-])N...}
24
    C[C@0H]1C[C@H](C2=C1C(=NC=N2)N3CCN(CC3)C(=0)[C...]
25
    O=C(N[C@H]1CC[C@H](N2CCN(CC3CC3)CC2)CC1)C4=CC=...
26
27
    CCN1CCN(CC1)CC2=CN=C(C=C2)NC3=NC=C(C(=N3)C4=CC...
    CC1=CC(=C(C=C1C2CCNCC2)OC(C)C)NC3=NC=C(C(=N3)N...
28
29
    CCC1=CN=CN=C1N2CCN(CC2)CC3=NC4=C(N3)C=C(C=C4)C...
    CC1=CC2=C(N1)C=CC(=C2F)OC3=NC=NC4=CC(=C(C=C43)...
31
    CC1=NN(C(=N1)C2=CN3CCOC4=C(C3=N2)C=CC(=C4)C5=C...
    CN(C)S(=0)(=0)N1CCN(CC1)C1=CC=C(OCC2=C(C(C)=NN...
32
33
    CC1=C(N=C1N)[COH](CC(=O)N)NC[COOH](C(=O)N)...
                                              structure
                                                              LogP
                                                                     NumHDonors
0
    <rdkit.Chem.rdchem.Mol object at 0x36b922030>
                                                           2.52660
                                                                                4
    <rdkit.Chem.rdchem.Mol object at 0x36b922880>
                                                                                2
1
                                                           5.93248
2
    <rdkit.Chem.rdchem.Mol object at 0x36b922730>
                                                                                3
                                                           3.31354
3
    <rdkit.Chem.rdchem.Mol object at 0x36b9229d0>
                                                          3.93950
                                                                                1
4
    <rdkit.Chem.rdchem.Mol object at 0x36b922a40>
                                                                                1
                                                           2.14840
                                                                                2
5
    <rdkit.Chem.rdchem.Mol object at 0x36b922ab0>
                                                           2.96582
    <rdkit.Chem.rdchem.Mol object at 0x36b922b20>
                                                           5.20190
                                                                                1
```

32

A-1210477

849.39

```
<rdkit.Chem.rdchem.Mol object at 0x36b922b90>
                                           3.73570
                                                          2
8
   <rdkit.Chem.rdchem.Mol object at 0x36b922c00>
                                           3.59260
9
   <rdkit.Chem.rdchem.Mol object at 0x36b922c70>
                                           3.94012
                                                          2
10
   <rdkit.Chem.rdchem.Mol object at 0x36b922ce0>
                                           2.34740
                                                          1
11
   <rdkit.Chem.rdchem.Mol object at 0x36b922d50>
                                           1.81280
                                                          1
                                           2.76190
12
   <rdkit.Chem.rdchem.Mol object at 0x36b922dc0>
                                                          3
13
   <rdkit.Chem.rdchem.Mol object at 0x36b922e30>
                                           3.01262
                                                          1
                                                          2
14
   <rdkit.Chem.rdchem.Mol object at 0x36b922ea0>
                                           7.88060
                                                          2
15
   <rdkit.Chem.rdchem.Mol object at 0x36b922f10>
                                           5.54080
   <rdkit.Chem.rdchem.Mol object at 0x36b922f80>
                                                          2
16
                                           2.37980
                                                          2
17
   <rdkit.Chem.rdchem.Mol object at 0x36b922ff0>
                                           3.83502
   <rdkit.Chem.rdchem.Mol object at 0x36b923060>
                                                          3
                                           6.19720
19
   <rdkit.Chem.rdchem.Mol object at 0x36b9230d0> -5.67050
                                                          2
   <rdkit.Chem.rdchem.Mol object at 0x36b923140>
20
                                           0.00130
                                                          6
                                                          3
21
   <rdkit.Chem.rdchem.Mol object at 0x36b9231b0>
                                           1.33860
                                                          2
22
   <rdkit.Chem.rdchem.Mol object at 0x36b923220>
                                           1.84680
                                                          3
23
   <rdkit.Chem.rdchem.Mol object at 0x36b923290>
                                           2.47110
24
                                                          2
   <rdkit.Chem.rdchem.Mol object at 0x36b923300>
                                           2.27850
                                           3.10100
                                                          2
25
   <rdkit.Chem.rdchem.Mol object at 0x36b923370>
26
   <rdkit.Chem.rdchem.Mol object at 0x36b9233e0>
                                                          2
                                           4.26720
                                           4.93692
27
   <rdkit.Chem.rdchem.Mol object at 0x36b923450>
                                                          1
28
   <rdkit.Chem.rdchem.Mol object at 0x36b9234c0>
                                                          3
                                           6.36192
29
   <rdkit.Chem.rdchem.Mol object at 0x36b923530>
                                                          1
                                           3.25630
                                                          1
30
   <rdkit.Chem.rdchem.Mol object at 0x36b9235a0>
                                           5.22422
31
   <rdkit.Chem.rdchem.Mol object at 0x36b923610>
                                                          1
                                           3.17422
   <rdkit.Chem.rdchem.Mol object at 0x36b923680>
                                           6.05282
                                                          1
33
   <rdkit.Chem.rdchem.Mol object at 0x36b9236f0> -7.70358
                                                         20
   NumHAcceptors
                 TPSA
                                                       Fingerprint
                96.25
0
                       8
                       1
                112.40
2
                       9
                106.51
3
                90.44
            10
                       [0, 0, 0, 0, 0, 0, 0, 0, 0, 1, 0, 0, 1, 1, \dots]
4
             9
                107.55
                       5
             9
                105.04
                       6
             5
                73.80
                       [0, 1, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, \dots]
7
                221.29
                       [0, 1, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, \dots]
            14
             3
                66.89
                       8
9
             8
                107.13
                       86.37
                       10
             4
                       11
             8
                89.63
12
             7
                100.13
                       [0, 1, 1, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, \dots]
```

4

7

13

14

15

16

17

 $[0, 1, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, \dots]$

[0, 1, 0, 0, 0, 0, 0, 0, 0, 1, 0, 0, 1, 0, ...

 $[0, 0, 1, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, \dots]$

[0, 1, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, ...

58.87

98.78

121.67

101.21

128.13

6

10

6

```
18
            14 204.66
                      [0, 1, 0, 0, 0, 0, 1, 1, 0, 0, 0, 0, 0, 1, 0, \dots]
19
             2
                70.00
                      206.07
                      20
            12
                      [0, 0, 0, 0, 0, 0, 1, 0, 0, 0, 0, 0, 0, ...
21
               160.83
            13
               104.89
22
             8
                      [0, 0, 0, 0, 0, 0, 0, 0, 0, 1, 0, 0, 0, 0, ...
23
                78.43
                      [0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 1, 0, 0, ...
             3
                      24
             7
                92.63
25
             6
                81.59
                      [0, 1, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, ...
               106.17
                      [0, 1, 0, 0, 0, 1, 0, 0, 0, 1, 0, 0, 0, 0, ...
26
             9
27
             8
                75.00
                      [0, 1, 1, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, \dots]
               105.24
                      [0, 1, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, \dots]
28
29
             5
                60.94
                      30
             6
                72.50
                      [0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 1, 0, \dots]
               118.67
                      [0, 1, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, \dots]
31
             9
32
               134.84
                      [0, 0, 0, 0, 0, 0, 0, 0, 1, 0, 0, 0, 0, 1, 0, \dots]
            11
33
               627.07
                      [0, 1, 0, 0, 0, 0, 0, 0, 1, 0, 0, 1, 0, 0, ...
            31
```

[13]: drugs_EDA[["Name","Molecular Mass", "LogP", "NumHDonors", "NumHAcceptors", "

"TPSA"]]

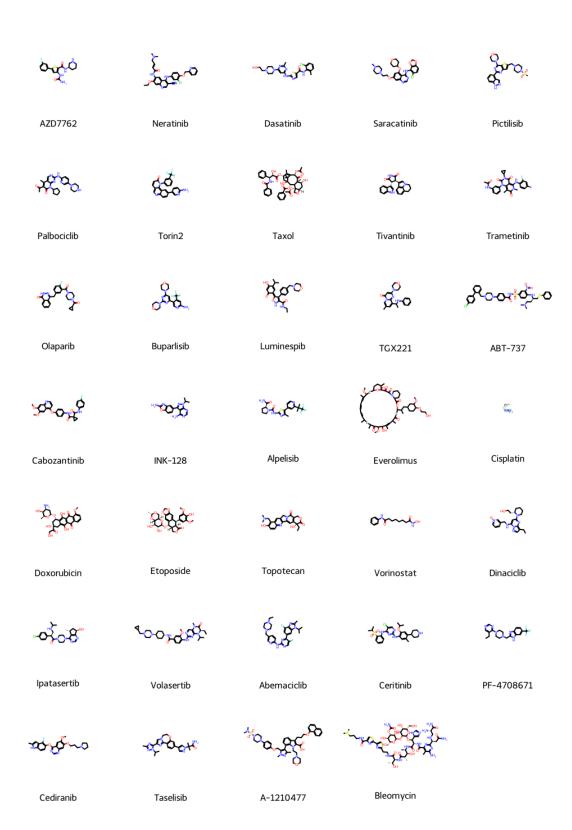
[13]:	Name	Molecular Mass	LogP	NumHDonors	NumHAcceptors	TPSA
0	AZD7762	362.12	2.52660	4	4	96.25
1	Neratinib	556.20	5.93248	2	8	112.40
2	Dasatinib	487.16	3.31354	3	9	106.51
3	Saracatinib	541.21	3.93950	1	10	90.44
4	Pictilisib	513.16	2.14840	1	9	107.55
5	Palbociclib	447.24	2.96582	2	9	105.04
6	Torin2	432.12	5.20190	1	5	73.80
7	Taxol	853.33	3.73570	4	14	221.29
8	Tivantinib	369.15	3.59260	2	3	66.89
9	Trametinib	615.08	3.94012	2	8	107.13
10	Olaparib	434.18	2.34740	1	4	86.37
11	Buparlisib	410.17	1.81280	1	8	89.63
12	Luminespib	465.23	2.76190	3	7	100.13
13	TGX221	364.19	3.01262	1	6	58.87
14	ABT-737	812.26	7.88060	2	10	128.13
15	Cabozantinib	501.17	5.54080	2	6	98.78
16	INK-128	309.13	2.37980	2	8	121.67
17	Alpelisib	441.14	3.83502	2	5	101.21
18	Everolimus	957.58	6.19720	3	14	204.66
19	Cisplatin	298.96	-5.67050	2	2	70.00
20	Doxorubicin	543.17	0.00130	6	12	206.07
21	Etoposide	588.18	1.33860	3	13	160.83
22	Topotecan	421.16	1.84680	2	8	104.89
23	Vorinostat	264.15	2.47110	3	3	78.43
24	Dinaciclib	396.23	2.27850	2	7	92.63
25	Ipatasertib	457.22	3.10100	2	6	81.59

```
26
     Volasertib
                        618.40 4.26720
                                                 2
                                                                9 106.17
27
    Abemaciclib
                        506.27 4.93692
                                                 1
                                                                   75.00
                                                 3
28
                        557.22 6.36192
                                                                8 105.24
      Ceritinib
29
     PF-4708671
                        390.18 3.25630
                                                                  60.94
                                                 1
30
      Cediranib
                        450.21 5.22422
                                                 1
                                                                6
                                                                  72.50
31
      Taselisib
                        460.23 3.17422
                                                 1
                                                                9 118.67
32
      A-1210477
                        849.39 6.05282
                                                 1
                                                               11 134.84
33
      Bleomycin
                       1414.52 -7.70358
                                                20
                                                               31 627.07
```

```
[14]: mols = [Chem.MolFromSmiles(smiles) for smiles in SmallMolecules["SMILES"]]
    names = SmallMolecules["Name"].tolist()

img = Draw.MolsToGridImage(
    mols,
    legends=names,
    molsPerRow=5,
    subImgSize=(200,200)

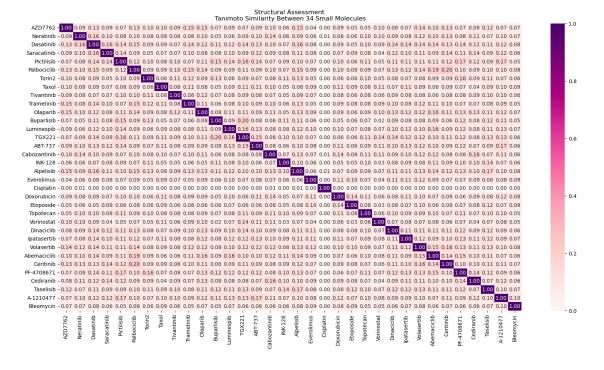
from IPython.display import display
display(img)
```



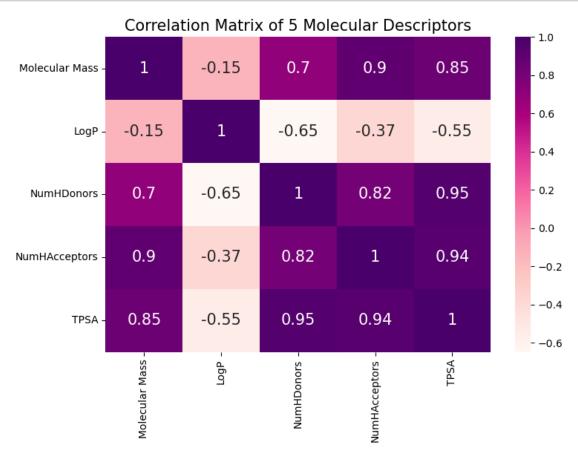
```
[15]: fps = drugs_EDA["Fingerprint"].tolist()
  names = drugs_EDA["Name"].tolist()
  n = len(fps)

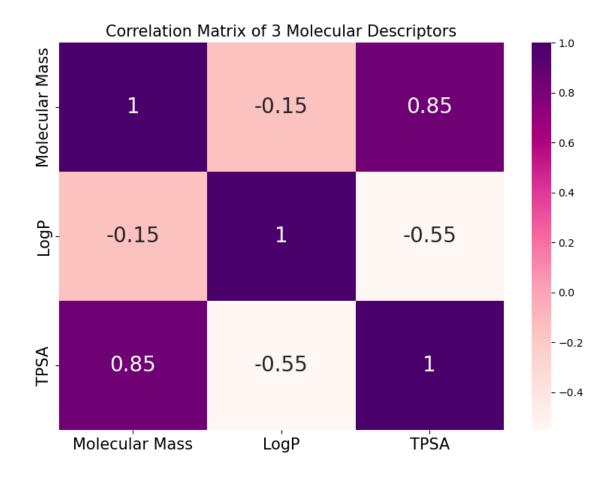
# similarity matrix
sim_matrix = np.zeros((n, n))
for i in range(n):
    for j in range(n):
        sim_matrix[i, j] = TanimotoSimilarity(fps[i], fps[j])

sim_df = pd.DataFrame(sim_matrix, index=names, columns=names)
```



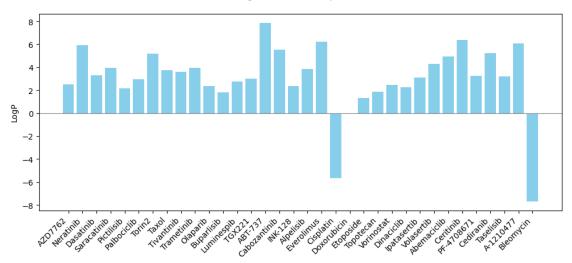
```
plt.yticks(fontsize=10)
plt.title("Correlation Matrix of 5 Molecular Descriptors", fontsize=15)
plt.tight_layout()
plt.show()
```





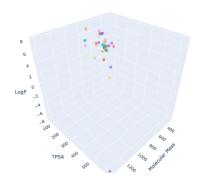
```
[33]: plt.figure(figsize=(10, 5))
  bars = plt.bar(drugs_EDA["Name"], drugs_EDA["LogP"], color='skyblue')
  plt.axhline(0, color='gray', linewidth=0.8)
  plt.ylabel("LogP")
  plt.title("LogP Values of Compounds", pad=20)
  plt.xticks(rotation=45, ha='right')
  plt.tight_layout()
  plt.show()
```

LogP Values of Compounds



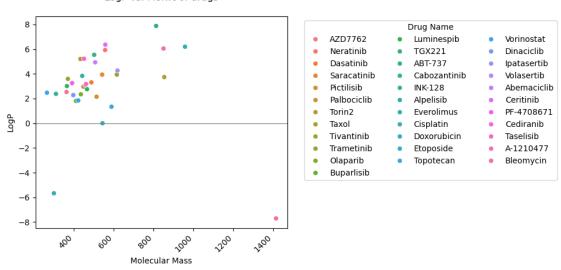
```
fig = px.scatter_3d(
    drugs_EDA,
    width=900,
    height=700,
    x="Molecular Mass",
    y="TPSA",
    z="LogP",
    color="Name",
    title="3D Projection of Molecular Descriptors",
    labels={"MolWt": "Molecular Weight", "TPSA": "TPSA", "LogP": "LogP"},
    opacity=0.7,)
fig.update_traces(marker=dict(size=5))
fig.show()
```

3D Projection of Molecular Descriptors

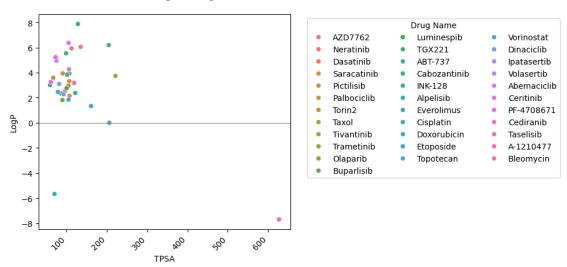


ame
AZD7762
Neratinib
Saracatinit
Saracatinit
Pictilisib
Palbacicibi
Torniz
Taxol
Tivantinib
Trametinib
Tramet

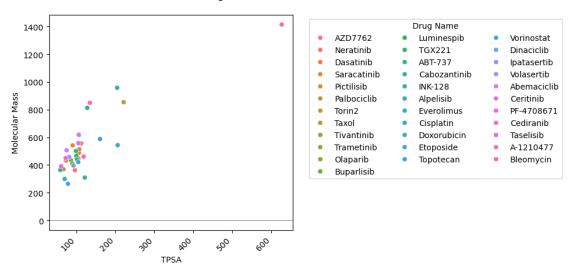
LogP vs. Molwt of drugs



TPSA vs. LogP of drugs



TPSA vs. Molwt of drugs



```
[46]: drugs_EDA = drugs_EDA[['Name', 'Molecular Mass', 'LogP', 'NumHDonors', Grant of the structure', 'SMILES', 'Fingerprint']]
```

Importance of TPSA:

https://pressbooks.openeducationalberta.ca/abcofpkpd/chapter/tpsa/

Topological polar surface area (TPSA), sometimes referred to simply as "polar surface area" (PSA) is a value that can be calculated for a drug that provides an indication of the drug's polarity, and thus an indication of its lipid solubility.

Drugs with higher TPSA values are less lipid-soluble and will, in general, be absorbed less extensively and more slowly, and will distribute less extensively, than drugs with lower TPSA values.

Once TPSA is known for a drug, the value can be used, for example, to predict the extent to which an oral dose of the drug will be absorbed from the GI tract into the portal circulation, or the extent to which the drug will partition into the brain from the plasma, by consulting published graphs that relate TPSA values to these drug behaviours.

TPSA is used as a translation for PK/PD.

