## Mol2Vec

## April 20, 2021

Reference taken from https://github.com/samoturk/mol2vec/blob/master/examples/02%20-%20Supervised%20machine%20learning%20with%20Mol2vec.ipynb

[1]: | !pip install git+https://github.com/samoturk/mol2vec

```
Collecting git+https://github.com/samoturk/mol2vec
  Cloning https://github.com/samoturk/mol2vec to
/private/var/folders/3p/mwxtj1wj179dmn25cxrq38380000gn/T/pip-req-build-ed1r2b7f
  Running command git clone -q https://github.com/samoturk/mol2vec
/private/var/folders/3p/mwxtj1wj179dmn25cxrq38380000gn/T/pip-req-build-ed1r2b7f
Requirement already satisfied (use --upgrade to upgrade): mol2vec==0.1 from
git+https://github.com/samoturk/mol2vec in
/Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages
Requirement already satisfied: numpy in
/Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
mol2vec==0.1) (1.18.5)
Requirement already satisfied: gensim in
/Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
mol2vec==0.1) (4.0.1)
Requirement already satisfied: tgdm in
/Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
mol2vec==0.1) (4.47.0)
Requirement already satisfied: joblib in
/Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
mol2vec==0.1) (0.16.0)
Requirement already satisfied: pandas in
/Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
mol2vec==0.1) (1.0.5)
Requirement already satisfied: matplotlib in
/Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
mol2vec==0.1) (3.2.2)
Requirement already satisfied: IPython in
/Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
mol2vec==0.1) (7.16.1)
Requirement already satisfied: seaborn in
/Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
mol2vec==0.1) (0.10.1)
```

```
Requirement already satisfied: scipy>=0.18.1 in
/Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
gensim->mol2vec==0.1) (1.5.0)
Requirement already satisfied: smart-open>=1.8.1 in
/Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
gensim->mol2vec==0.1) (5.0.0)
Requirement already satisfied: pytz>=2017.2 in
/Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
pandas->mol2vec==0.1) (2020.1)
Requirement already satisfied: python-dateutil>=2.6.1 in
/Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
pandas->mol2vec==0.1) (2.8.1)
Requirement already satisfied: kiwisolver>=1.0.1 in
/Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
matplotlib->mol2vec==0.1) (1.2.0)
Requirement already satisfied: cycler>=0.10 in
/Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
matplotlib->mol2vec==0.1) (0.10.0)
Requirement already satisfied: pyparsing!=2.0.4,!=2.1.2,!=2.1.6,>=2.0.1 in
/Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
matplotlib->mol2vec==0.1) (2.4.7)
Requirement already satisfied: pygments in
/Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
IPython->mol2vec==0.1) (2.6.1)
Requirement already satisfied: pexpect; sys_platform != "win32" in
/Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
IPython->mol2vec==0.1) (4.8.0)
Requirement already satisfied: appnope; sys_platform == "darwin" in
/Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
IPython->mol2vec==0.1) (0.1.0)
Requirement already satisfied: prompt-toolkit!=3.0.0,!=3.0.1,<3.1.0,>=2.0.0 in
/Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
IPython->mol2vec==0.1) (3.0.5)
Requirement already satisfied: pickleshare in
/Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
IPython->mol2vec==0.1) (0.7.5)
Requirement already satisfied: jedi>=0.10 in
/Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
IPython->mol2vec==0.1) (0.17.1)
Requirement already satisfied: backcall in
/Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
IPython->mol2vec==0.1) (0.2.0)
Requirement already satisfied: setuptools>=18.5 in
/Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
IPython->mol2vec==0.1) (49.2.0.post20200714)
Requirement already satisfied: decorator in
/Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
IPython->mol2vec==0.1) (4.4.2)
```

```
Requirement already satisfied: traitlets>=4.2 in
    /Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
    IPython->mol2vec==0.1) (4.3.3)
    Requirement already satisfied: six>=1.5 in
    /Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from python-
    dateutil>=2.6.1->pandas->mol2vec==0.1) (1.15.0)
    Requirement already satisfied: ptyprocess>=0.5 in
    /Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from pexpect;
    sys platform != "win32"->IPython->mol2vec==0.1) (0.6.0)
    Requirement already satisfied: wcwidth in
    /Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from prompt-
    toolkit!=3.0.0,!=3.0.1,<3.1.0,>=2.0.0->IPython->mol2vec==0.1) (0.2.5)
    Requirement already satisfied: parso<0.8.0,>=0.7.0 in
    /Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
    jedi >= 0.10 -> IPython -> mol2vec == 0.1) (0.7.0)
    Requirement already satisfied: ipython-genutils in
    /Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages (from
    traitlets>=4.2->IPython->mol2vec==0.1) (0.2.0)
    Building wheels for collected packages: mol2vec
      Building wheel for mol2vec (setup.py) ... done
      Created wheel for mol2vec: filename=mol2vec-0.1-py3-none-any.whl
    size=14026
    sha256=902e226948cc2e52eb4e133b709825aebcfa0609628630978e12722667bd5af1
      Stored in directory:
    /private/var/folders/3p/mwxtj1wj179dmn25cxrq38380000gn/T/pip-ephem-wheel-cache-3
    6bl0mc2/wheels/28/66/2a/543e91280db70c489a72de9c9fa26dca4caa7113721fb03b86
    Successfully built mol2vec
[2]: import numpy as np
     import pandas as pd
     import sys, os
     sys.path.append(os.path.dirname(os.path.dirname(os.getcwd()))+'/mol2vec')
```

```
RDKit WARNING: [02:43:58] Enabling RDKit 2019.09.3 jupyter extensions /Users/shrutidudwadkar/opt/anaconda3/lib/python3.8/site-packages/gensim/similarities/__init__.py:15: UserWarning: The gensim.similarities.levenshtein submodule is disabled, because the optional Levenshtein package <a href="https://pypi.org/project/python-Levenshtein">https://pypi.org/project/python-Levenshtein</a> is unavailable. Install Levenhstein (e.g. `pip install python-Levenshtein`) to
```

from mol2vec.features import mol2alt\_sentence, mol2sentence, MolSentence,

from rdkit import Chem

→DfVec, sentences2vec

from rdkit.Chem import PandasTools

from gensim.models import word2vec

from rdkit.Chem.Draw import IPythonConsole

```
suppress this warning.
      warnings.warn(msg)
    Importing the BindingDB Kd dataset
[3]: from tdc.multi_pred import DTI
     bindingDB_data = DTI(name = 'BindingDB_Kd')
    Found local copy...
    Loading...
    Done!
[4]: bindingDB_cold_split = bindingDB_data.get_split(method = 'cold_split',_
      \rightarrowcolumn_name = 'Drug', seed = 42, frac = [0.7, 0.1, 0.2])
[5]:
     train_set = bindingDB_cold_split['train']
[6]:
     train set
[6]:
               Drug_ID
                                                                         Drug \
                 4316.0
                                COc1ccc(CNS(=0)(=0)c2ccc(S(N)(=0)=0)s2)cc1
     0
     1
                 4293.0
                                      NS(=0) (=0) c1ccc(S(=0) (=0) NCc2cccs2) s1
     2
                 1612.0
                            COc1ccc(N2CC(0)c3cc(S(N)(=0)=0)sc3S2(=0)=0)cc1
     3
                            CCN[C@H] 1CN(CCOC)S(=0) (=0) c2sc(S(N) (=0)=0) cc21
             4369102.0
     4
                68844.0
                           CCN[C@H] 1CN(CCCOC)S(=0) (=0) c2sc(S(N)(=0)=0) cc21
     34696
            76311094.0
                                   O=C(NCCCCS(=0)(=0)c1ccccc1)c1ccc2nccn2c1
     34697
            57406853.0
                         CCDc1cc(C(C)(C)C)ccc1C1=N[C@@](C)(c2ccc(C1)cc2...
     34698
            58573469.0
                         CC(C)[C@@H](CS(=0)(=0)C(C)C)N1C(=0)[C@@](C)(CC...
     34699
                                                CCCCCCCCC10C(CO)C(O)C(O)C10
              113557.0
     34700
              113557.0
                                                CCCCCCCC10C(C0)C(0)C(0)C10
           Target_ID
                                                                     Target
                                                                                    Y
     0
              P00918
                       MSHHWGYGKHNGPEHWHKDFPIAKGERQSPVDIDTHTAKYDPSLKP...
                                                                             0.490
     1
              P00918 MSHHWGYGKHNGPEHWHKDFPIAKGERQSPVDIDTHTAKYDPSLKP...
                                                                             0.830
     2
              P00918
                       MSHHWGYGKHNGPEHWHKDFPIAKGERQSPVDIDTHTAKYDPSLKP...
                                                                             0.160
     3
              P00918 MSHHWGYGKHNGPEHWHKDFPIAKGERQSPVDIDTHTAKYDPSLKP...
                                                                             0.320
     4
              P00918 MSHHWGYGKHNGPEHWHKDFPIAKGERQSPVDIDTHTAKYDPSLKP...
                                                                             0.130
              P43490 MNPAAEAEFNILLATDSYKVTHYKQYPPNTSKVYSYFECREKKTEN...
                                                                           860.000
     34696
     34697
                  \mathtt{NaN}
                       MCNTNMSVPTDGAVTTSQIPASEQETLVRPKPLLLKLLKSVGAQKD...
                                                                             2.900
     34698
                  NaN MCNTNMSVPTDGAVTTSQIPASEQETLVRPKPLLLKLLKSVGAQKD...
                                                                             0.045
```

[34701 rows x 5 columns]

P08191

P08191

34699

34700

MKRVITLFAVLLMGWSVNAWSFACKTANGTAIPIGGGSANVYVNLA...

MKRVITLFAVLLMGWSVNAWSFACKTANGTAIPIGGGSANVYVNLA...

17.000

19.000

```
[7]: dataSource = train_set.drop(['Target_ID', 'Drug_ID', 'Y'], axis=1)
dataSource['Mol'] = ''
```

Load the pre-trained Mol2vec model

```
[8]: model = word2vec.Word2Vec.load('model_300dim.pkl')
```

```
[9]: from rdkit import Chem
import tensorflow as tf
import torch

for ind, drug in enumerate(dataSource['Drug']):
    mol = Chem.MolFromSmiles(drug)
    dataSource['Mol'][ind] = mol
```

```
[10]: dataSource['Sentence'] = dataSource.apply(lambda x:

→MolSentence(mol2alt_sentence(x['Mol'], 1)), axis=1)
```

Method taken from mol2vec and updated as per the changes in the gensim. Tweeked the 'sentences2vec' method provided in Mol2Vec library to make it compatible with gensim 4.0

```
[12]: dataSource['mol2vec'] = ''
dataSource['mol2vec'] = [DfVec(x) for x in

→sentences2vec(dataSource['Sentence'], model, unseen='UNK')]
```

```
[13]: X = np.array([x.vec for x in dataSource['mol2vec']])
```

```
[14]: from torch.utils.data import DataLoader
      train_loader = DataLoader(dataset=X, shuffle=True, batch_size=256)
[15]: from sklearn.cluster import AgglomerativeClustering
      clustering = AgglomerativeClustering(linkage='average', n_clusters=50)
      clusters=[]
      for i, batch in enumerate(train_loader):
          clustering.fit(batch)
          clusters.extend(clustering.labels_)
     Grouping the dataframe based on the clusters formed
[16]: dataSource['Clusters'] = clusters
      by_clusters = dataSource.groupby(['Clusters'])
[17]: dataSource
[17]:
                                                            Drug \
      0
                    COc1ccc(CNS(=0)(=0)c2ccc(S(N)(=0)=0)s2)cc1
                          NS(=0)(=0)c1ccc(S(=0)(=0)NCc2cccs2)s1
      1
      2
                COc1ccc(N2CC(0)c3cc(S(N)(=0)=0)sc3S2(=0)=0)cc1
      3
                CCN[C@H] 1CN(CCOC)S(=0) (=0) c2sc(S(N) (=0)=0) cc21
               CCN[C@H] 1CN(CCCOC)S(=0) (=0) c2sc(S(N) (=0)=0) cc21
                       O=C(NCCCCS(=0)(=0)c1ccccc1)c1ccc2nccn2c1
      34696
             CCOc1cc(C(C)(C)C)ccc1C1=N[C@@](C)(c2ccc(C1)cc2...
      34697
      34698
             CC(C)[C@@H](CS(=0)(=0)C(C)C)N1C(=0)[C@@](C)(CC...
      34699
                                    CCCCCCCCC10C(C0)C(0)C(0)C10
      34700
                                    CCCCCCCCC10C(C0)C(0)C(0)C10
                                                          Target \
             MSHHWGYGKHNGPEHWHKDFPIAKGERQSPVDIDTHTAKYDPSLKP...
      0
      1
             MSHHWGYGKHNGPEHWHKDFPIAKGERQSPVDIDTHTAKYDPSLKP...
      2
             MSHHWGYGKHNGPEHWHKDFPIAKGERQSPVDIDTHTAKYDPSLKP...
      3
             MSHHWGYGKHNGPEHWHKDFPIAKGERQSPVDIDTHTAKYDPSLKP...
      4
             MSHHWGYGKHNGPEHWHKDFPIAKGERQSPVDIDTHTAKYDPSLKP...
      34696 MNPAAEAEFNILLATDSYKVTHYKQYPPNTSKVYSYFECREKKTEN...
      34697
             MCNTNMSVPTDGAVTTSQIPASEQETLVRPKPLLLKLLKSVGAQKD...
      34698 MCNTNMSVPTDGAVTTSQIPASEQETLVRPKPLLLKLLKSVGAQKD...
      34699
             MKRVITLFAVLLMGWSVNAWSFACKTANGTAIPIGGGSANVYVNLA...
      34700 MKRVITLFAVLLMGWSVNAWSFACKTANGTAIPIGGGSANVYVNLA...
                                                             Mol \
      0
             <img data-content="rdkit/molecule" src="data:i...</pre>
```

```
2
             <img data-content="rdkit/molecule" src="data:i...</pre>
      3
             <img data-content="rdkit/molecule" src="data:i...</pre>
      4
             <img data-content="rdkit/molecule" src="data:i...</pre>
             <img data-content="rdkit/molecule" src="data:i...</pre>
      34696
      34697
             <img data-content="rdkit/molecule" src="data:i...</pre>
      34698
             <img data-content="rdkit/molecule" src="data:i...</pre>
             <img data-content="rdkit/molecule" src="data:i...</pre>
      34699
             <img data-content="rdkit/molecule" src="data:i...</pre>
      34700
                                                         Sentence \
      0
             (2246728737, 3975275337, 864674487, 2076190208...
      1
             (847957139, 3275683399, 999334238, 3532053313,...
      2
             (2246728737, 3975275337, 864674487, 2076190208...
             (2246728737, 3542456614, 2245384272, 773607102...
      3
      4
             (2246728737, 3542456614, 2245384272, 773607102...
      34696
             (864942730, 1510328189, 2246699815, 1054767590...
             (2246728737, 3542456614, 2245384272, 399408866...
      34697
      34698
             (2246728737, 3537119515, 2245273601, 300433380...
             (2246728737, 3542456614, 2245384272, 117312591...
      34699
      34700 (2246728737, 3542456614, 2245384272, 117312591...
                                mol2vec Clusters
      0
             (300,) dimensional vector
             (300,) dimensional vector
      1
                                                 5
      2
             (300,) dimensional vector
                                                 4
      3
             (300,) dimensional vector
                                                 5
      4
             (300,) dimensional vector
                                                 3
      34696 (300,) dimensional vector
                                                 6
      34697
             (300,) dimensional vector
                                                17
      34698
             (300,) dimensional vector
                                                15
      34699
             (300,) dimensional vector
                                                30
      34700 (300,) dimensional vector
                                                 0
      [34701 rows x 6 columns]
[18]: for cluster, data in by_clusters:
          print(f"First 2 entries for cluster: ", cluster)
          print("----")
          print(data.head(2))
     First 2 entries for cluster: 0
```

<img data-content="rdkit/molecule" src="data:i...</pre>

1

Drug \

```
10
            NS(=0)(=0)c1ccc(C(=0)NCc2cc(F)ccc2F)cc1
14 NS(=0)(=0)c1ccc(C(=0)NCc2c(F)c(F)c(F)c(F)c2F)cc1
                                              Target \
10 SHHWGYGKHNGPEHWHKDFPIAKGERQSPVDIDTHTAKYDPSLKPL...
14 SHHWGYGKHNGPEHWHKDFPIAKGERQSPVDIDTHTAKYDPSLKPL...
                                                 Mol \
10 <img data-content="rdkit/molecule" src="data:i...
14 <img data-content="rdkit/molecule" src="data:i...
                                            Sentence \
10 (847957139, 3275683399, 999334238, 3532053313,...
14 (847957139, 3275683399, 999334238, 3532053313,...
                     mol2vec Clusters
10 (300,) dimensional vector
14 (300,) dimensional vector
First 2 entries for cluster: 1
-----
159 0=C1c2cc(F)ccc2-c2cc(F)c([N+](=0)[0-])cc21
187
                     CC(C)NCC(O)c1ccc2cccc2c1
                                               Target \
159 MSGETTRLTEPQLRELAARGAAELDGATATDMLRWTDETFGDIGGA...
187 MGQPGNGSAFLLAPNGSHAPDHDVTQERDEVWVVGMGIVMSLIVLA...
159 <img data-content="rdkit/molecule" src="data:i...
187 <img data-content="rdkit/molecule" src="data:i...
                                             Sentence \
   (864942730, 10565946, 3217380708, 1630260676, ...
159
   (2246728737, 3537119515, 2245273601, 263530394...
187
                      mol2vec Clusters
159 (300,) dimensional vector
187 (300,) dimensional vector
First 2 entries for cluster: 2
                                                 Drug \
             NS(=0)(=0)c1ccc(C(=0)NCc2c(F)ccc2F)cc1
11
43 Cc1ccc(NC(=0)c2ccc(CN3CCN(C)CC3)cc2)cc1Nc1nccc...
                                              Target \
11 SHHWGYGKHNGPEHWHKDFPIAKGERQSPVDIDTHTAKYDPSLKPL...
43 HHSTVADGLITTLHYPAPKRNKPTVYGVSPNYDKWEMERTDITMKH...
```

```
Mol \
11 <img data-content="rdkit/molecule" src="data:i...
43 <img data-content="rdkit/molecule" src="data:i...
11 (847957139, 3275683399, 999334238, 3532053313,...
43 (2246728737, 422715066, 3217380708, 3124581743...
                      mol2vec Clusters
11 (300,) dimensional vector
43 (300,) dimensional vector
First 2 entries for cluster: 3
                                                  Drug \
      CCN[C@H] 1CN(CCCOC)S(=0) (=0) c2sc(S(N)(=0)=0) cc21
74 COc1cc2c(N3CCN(C(=0)Nc4ccc(OC(C)C)cc4)CC3)ncnc...
                                                Target \
    MSHHWGYGKHNGPEHWHKDFPIAKGERQSPVDIDTHTAKYDPSLKP...
74 HHSTVADGLITTLHYPAPKRNKPTVYGVSPNYDKWEMERTDITMKH...
   <img data-content="rdkit/molecule" src="data:i...</pre>
74 <img data-content="rdkit/molecule" src="data:i...
                                              Sentence \
    (2246728737, 3542456614, 2245384272, 773607102...
74 (2246728737, 3975275337, 864674487, 2076190208...
                      mol2vec Clusters
    (300,) dimensional vector
74 (300,) dimensional vector
First 2 entries for cluster: 4
                                                 Drug \
      COc1ccc(N2CC(0)c3cc(S(N)(=0)=0)sc3S2(=0)=0)cc1
6 CN[C@@H]1CN(c2cccc(OC)c2)S(=0)(=0)c2sc(S(N)(=0...
                                               Target \
2 MSHHWGYGKHNGPEHWHKDFPIAKGERQSPVDIDTHTAKYDPSLKP...
6 MSHHWGYGKHNGPEHWHKDFPIAKGERQSPVDIDTHTAKYDPSLKP...
                                                  Mol \
2 <img data-content="rdkit/molecule" src="data:i...
6 <img data-content="rdkit/molecule" src="data:i...
```

Sentence \

```
2 (2246728737, 3975275337, 864674487, 2076190208...
6 (2246728737, 3824063894, 847961216, 1732628033...
                    mol2vec Clusters
2 (300,) dimensional vector
6 (300,) dimensional vector
First 2 entries for cluster: 5
                                             Drug \
           NS(=0)(=0)c1ccc(S(=0)(=0)NCc2cccs2)s1
1
3 CCN[COH] 1CN(CCOC)S(=0) (=0) c2sc(S(N)(=0)=0) cc21
                                              Target \
1 MSHHWGYGKHNGPEHWHKDFPIAKGERQSPVDIDTHTAKYDPSLKP...
3 MSHHWGYGKHNGPEHWHKDFPIAKGERQSPVDIDTHTAKYDPSLKP...
                                                 Mol \
1 <img data-content="rdkit/molecule" src="data:i...</pre>
3 <img data-content="rdkit/molecule" src="data:i...
                                            Sentence \
1 (847957139, 3275683399, 999334238, 3532053313,...
3 (2246728737, 3542456614, 2245384272, 773607102...
                    mol2vec Clusters
1 (300,) dimensional vector
3 (300,) dimensional vector
First 2 entries for cluster: 6
                                                                   Target \
                  Drug
15 NS(=0)(=0)c1cccc1 MASPDWGYDDKNGPEQWSKLYPIANGNNQSPVDIKTSETKHDTSLK...
17 NS(=0)(=0)c1ccccc1 MSHHWGYGKHNGPEHWHKDFPIAKGERQSPVDIDTHTAKYDPSLKP...
                                                  Mol \
15 <img data-content="rdkit/molecule" src="data:i...
17 <img data-content="rdkit/molecule" src="data:i...
                                             Sentence \
15 (847957139, 3275683399, 999334238, 3532053313,...
17 (847957139, 3275683399, 999334238, 3532053313,...
                      mol2vec Clusters
15 (300,) dimensional vector
17 (300,) dimensional vector
First 2 entries for cluster: 7
                                                 Drug \
```

24 CN[C@@H](C)C(=0)N[C@H](C(=0)N1C[C@@H](Oc2cccc...

```
48 Cc1ccc(NC(=0)c2ccc(CN3CCN(C)CC3)cc2)cc1Nc1nccc...
                                              Target \
24 MSDAVSSDRNFPNSTNLPRNPSMADYEARIFTFGTWIYSVNKEQLA...
48 HHSTVADGLITTLHYPAPKRNKPTVYGVSPNYDKWEMERTDITMKH...
                                                 Mol \
24 <img data-content="rdkit/molecule" src="data:i...
48 <img data-content="rdkit/molecule" src="data:i...
                                            Sentence \
24 (2246728737, 3824063894, 847961216, 1362425715...
48 (2246728737, 422715066, 3217380708, 3124581743...
                     mol2vec Clusters
24 (300,) dimensional vector
48 (300,) dimensional vector
First 2 entries for cluster: 8
                                                Drug \
71 CCN(CC)CCNC(=0)c1c(C)[nH]c(/C=C2\C(=0)Nc3ccc(F...
87 COc1cc2c(N3CCN(C(=0)Nc4ccc(OC(C)C)cc4)CC3)ncnc...
                                              Target \
71 HHSTVADGLITTLHYPAPKRNKPTVYGVSPNYDKWEMERTDITMKH...
87 MRGARGAWDFLCVLLLLLRVQTGSSQPSVSPGEPSPPSIHPGKSDL...
                                                 Mol \
71 <img data-content="rdkit/molecule" src="data:i...
87 <img data-content="rdkit/molecule" src="data:i...
                                            Sentence \
71 (2246728737, 3542456614, 2245384272, 592593828...
87 (2246728737, 3975275337, 864674487, 2076190208...
                     mol2vec Clusters
71 (300,) dimensional vector
87 (300,) dimensional vector
First 2 entries for cluster: 9
-----
                                  Drug \
   NS(=0)(=0)c1ccc(C(=0)NCc2cccc2)cc1
7
31 Cc1sc(NC(=0)[C@H](C)N)nc1-c1ccccc1
                                              Target \
   SHHWGYGKHNGPEHWHKDFPIAKGERQSPVDIDTHTAKYDPSLKPL...
```

31 MSDAVSSDRNFPNSTNLPRNPSMADYEARIFTFGTWIYSVNKEQLA...

```
7
    <img data-content="rdkit/molecule" src="data:i...</pre>
31 <img data-content="rdkit/molecule" src="data:i...
                                             Sentence \
    (847957139, 3275683399, 999334238, 3532053313,...
31 (2246728737, 422715066, 3217380708, 2718013753...
                      mol2vec Clusters
    (300,) dimensional vector
7
31 (300,) dimensional vector
First 2 entries for cluster: 10
                                      Drug \
  NS(=0)(=0)c1ccc(C(=0)NCc2ccc(F)cc2)cc1
9 NS(=0)(=0)c1ccc(C(=0)NCc2ccc(F)cc2F)cc1
                                              Target \
8 SHHWGYGKHNGPEHWHKDFPIAKGERQSPVDIDTHTAKYDPSLKPL...
9 SHHWGYGKHNGPEHWHKDFPIAKGERQSPVDIDTHTAKYDPSLKPL...
                                                 Mol \
8 <img data-content="rdkit/molecule" src="data:i...
9 <img data-content="rdkit/molecule" src="data:i...
                                             Sentence \
8 (847957139, 3275683399, 999334238, 3532053313,...
9 (847957139, 3275683399, 999334238, 3532053313,...
                     mol2vec Clusters
8 (300,) dimensional vector
9 (300,) dimensional vector
First 2 entries for cluster: 11
219
                   CC12CC(=0)C3c4ccc(0)cc4CCC3C1CCC2=0
264 NC(=0)CCCCCNC(=0)OC[C@H]10[C@@H](n2cnc3c(N)ncn...
                                                 Target \
219 MSAVALPRVSGGHDEHGHLEEFRTDPIGLMQRVRDECGDVGTFQLA...
264 MGNAAAAKKGSEQESVKEFLAKAKEDFLKKWETPSQNTAQLDQFDR...
                                                   Mol \
219 <img data-content="rdkit/molecule" src="data:i...
264 <img data-content="rdkit/molecule" src="data:i...
                                              Sentence \
219 (2246728737, 1861965050, 2976816164, 101278089...
```

264 (847957139, 2591432844, 2246699815, 3328145258
mol2vec Clusters 219 (300,) dimensional vector 11 264 (300,) dimensional vector 11 First 2 entries for cluster: 12
Drug \ 242
Target \ 242 MRPSGTAGAALLALLAALCPASRALEEKKVCQGTSNKLTQLGTFED 439 MRHSKRTHCPDWDSRESWGHESYRGSHKRKRRSHSSTQENRHCKPH
Mol \ 242

Drug  18 NS(=0)(=0)c1ccc(C(=0)NCCOCCOCCN(CC(=0)[0-])CC(  41 C[C@H](N)C(=0)Nc1nc2c(s1)CCc1ccccc1-2	\
Target  18 MSHHWGYGKHNGPEHWHKDFPIAKGERQSPVDIDTHTAKYDPSLKP 41 MSDAVSSDRNFPNSTNLPRNPSMADYEARIFTFGTWIYSVNKEQLA	\
Mol 18	

```
172 MGAGVLVLGASEPGNLSSAAPLPDGAATAARLLVPASPPASLLPPA...
388 MTSSLQRPWRVPWLPWTILLVSTAAASQNQERLCAFKDPYQQDLGI...
                                                    Mol \
172
    <img data-content="rdkit/molecule" src="data:i...</pre>
388 <img data-content="rdkit/molecule" src="data:i...
                                               Sentence \
172 (2246997334, 3696402029, 2246703798, 535847852...
388 (2246728737, 3657471097, 2092489639, 202181243...
                       mol2vec Clusters
172 (300,) dimensional vector
388 (300,) dimensional vector
First 2 entries for cluster: 17
                                                   Drug \
22
    CN[COOH](C)C(=O)N[COH](C(=O)N1CCC[COH]1C(=O)NC...
132 CO[C@@H] 10[C@H] (CO) [C@@H] (O[C@@H] 20[C@H] (CO) [C...
                                                 Target \
22
    MSDAVSSDRNFPNSTNLPRNPSMADYEARIFTFGTWIYSVNKEQLA...
132 MMLSLNNLQNIIYNPVIPFVGTIPDQLDPGTLIVIRGHVPSDADRF...
                                                    Mol \
22
     <img data-content="rdkit/molecule" src="data:i...</pre>
132 <img data-content="rdkit/molecule" src="data:i...
22
     (2246728737, 3824063894, 847961216, 1362425715...
132 (2246728737, 3975275337, 864674487, 1978844073...
                       mol2vec Clusters
     (300,) dimensional vector
22
132 (300,) dimensional vector
                                       17
First 2 entries for cluster: 18
                                                   Drug \
229 CC(COc1nccc(-c2nc(-c3ccncc3)c(-c3ccc4c(c3)CCC4...
231
    O=NC1CCc2cc(-c3[nH]c(C4CCNCC4)nc3-c3ccncc3)ccc21
                                                 Target \
229 MAALSGGGGGAEPGQALFNGDMEPEAGAGAAASSAADPAIPEE...
231 MAALSGGGGGAEPGQALFNGDMEPEAGAGAGAAASSAADPAIPEE...
229 <img data-content="rdkit/molecule" src="data:i...
231 <img data-content="rdkit/molecule" src="data:i...
```

Sentence \ 229 (2246728737, 3537119515, 2245273601, 486030630 231 (864942730, 2380084179, 847336149, 3977339131,	\
mol2vec Clusters 229 (300,) dimensional vector 18 231 (300,) dimensional vector 18 First 2 entries for cluster: 19	
Drug \ 34 C[C@H](N)C(=0)Nc1nc(-c2ccc(Cc3ccccc3)cc2)c(-c2 58 Cc1ccc(-n2nc(C(C)(C)C)cc2NC(=0)Nc2ccc(OCCN3CCO	
Target \ 34 MSDAVSSDRNFPNSTNLPRNPSMADYEARIFTFGTWIYSVNKEQLA 58 HHSTVADGLITTLHYPAPKRNKPTVYGVSPNYDKWEMERTDITMKH	
Mol \ 34	

mol2vec Clusters

75 (300,) dimensional vector 20 210 (300,) dimensional vector 20	
First 2 entries for cluster: 21	
Drug \ 20  CN[C@@H](C)C(=0)N[C@H](C(=0)N1CCC[C@H]1C(=0)N[ 28  Cc1cc(C)c2ccc(NC(=0)[C@H](C)N)nc2n1	\
Target \ 20 MSDAVSSDRNFPNSTNLPRNPSMADYEARIFTFGTWIYSVNKEQLA 28 MSDAVSSDRNFPNSTNLPRNPSMADYEARIFTFGTWIYSVNKEQLA	\
Mol V  20	

474	O=C1Nc2cccc2/C1=C1/SC(=S)N(C(Cc2ccc(0)cc2)C(=	
200 474	Target MAPWPHENSSLAPWPDLPTLAPNTANTSGLPGVPWEAALAGALLAL MQPMTARFDLFVVGSGFFGLTIAERVATQLDKRVLVLERRPHIGGN	\
200 474	Mol	

```
Mol \
90
     <img data-content="rdkit/molecule" src="data:i...</pre>
403 <img data-content="rdkit/molecule" src="data:i...
                                               Sentence \
     (2246728737, 1861965050, 2976816164, 387115942...
90
403
    (2246728737, 3824063894, 847961216, 828793177,...
                       mol2vec Clusters
90
     (300,) dimensional vector
403 (300,) dimensional vector
                                       25
First 2 entries for cluster: 26
                                                   Drug \
149
                                   CCCCCCCCCC(=0)[0-]
342 CCOc1cc2ncc(C#N)c(Nc3ccc(F)c(C1)c3)c2cc1NC(=0)...
                                                 Target \
149 MGLEKTVKEKLSFEGVGIHTGEYSKLIIHPEKEGTGIRFFKNGVYI...
342 MGAIGLLWLLPLLLSTAAVGSGMGTGQRAGSPAAGPPLQPREPLSY...
                                                    Mol \
     <img data-content="rdkit/molecule" src="data:i...</pre>
342 <img data-content="rdkit/molecule" src="data:i...
                                               Sentence \
149 (2246728737, 3542456614, 2245384272, 117312591...
342
    (2246728737, 3542456614, 2245384272, 399408866...
                       mol2vec Clusters
149 (300,) dimensional vector
                                       26
342 (300,) dimensional vector
                                       26
First 2 entries for cluster: 27
35
     C[CQH](N)C(=0)Nc1nc(-c2cccc(Cc3ccccc3)c2)c(Cc2...
298 COc1ccc2c(c1)c(CC(=0)NCc1ccncc1)c(C)n2C(=0)c1c...
                                                 Target \
35
     MSDAVSSDRNFPNSTNLPRNPSMADYEARIFTFGTWIYSVNKEQLA...
298 MFIEAIVLALTALILYSVYSVKSFNTTRPTDPPVYPVTVPFLGHIV...
                                                    Mol \
35
     <img data-content="rdkit/molecule" src="data:i...</pre>
298 <img data-content="rdkit/molecule" src="data:i...
                                               Sentence \
35
     (2246728737, 3537119515, 2245273601, 265540621...
```

298 (2246728737, 3975275337, 864674487, 2076190208	
mol2vec Clusters 35 (300,) dimensional vector 27 298 (300,) dimensional vector 27 First 2 entries for cluster: 28	
Drug 98	\
Target 98 MDPLNLSWYDDDLERQNWSRPFNGSDGKADRPHYNYYATLLTLLIA 421 MAKQYDSVECPFCDEVSKYEKLAKIGQGTFGEVFKARHRKTGQKVA	\
Mol 98	

Drug 51	\
Target 51 MRGARGAWDFLCVLLLLLRVQTGSSQPSVSPGEPSPPSIHPGKSDL 111 MADNFSLHDALSGSGNPNPQGWPGAWGNQPAGAGGYPGASYPGAYP	\
Mol 51	

```
16
    MASPDWGYDDKNGPEQWSKLYPIANGNNQSPVDIKTSETKHDTSLK...
275 MGNAAAAKKGSEQESVKEFLAKAKEDFLKKWETPSQNTAQLDQFDR...
                                                    Mol \
16
     <img data-content="rdkit/molecule" src="data:i...</pre>
275 <img data-content="rdkit/molecule" src="data:i...
                                               Sentence \
     (847957139, 3275683399, 999334238, 3532053313,...
16
275 (847957139, 2591432844, 2246699815, 3304582332...
                       mol2vec Clusters
16
     (300,) dimensional vector
275 (300,) dimensional vector
First 2 entries for cluster: 33
                                                   Drug \
72
    COc1cc2c(N3CCN(C(=0)Nc4ccc(OC(C)C)cc4)CC3)ncnc...
258 NC(=0)[C@@H](CCCN=C(N)N)NC(=0)CCCCCNC(=0)[C@H]...
72
    HHSTVADGLITTLHYPAPKRNKPTVYGVSPNYDKWEMERTDITMKH...
258 MGNAAAAKKGSEQESVKEFLAKAKEDFLKKWETPSQNTAQLDQFDR...
                                                    Mol \
72
     <img data-content="rdkit/molecule" src="data:i...</pre>
258 <img data-content="rdkit/molecule" src="data:i...
72
     (2246728737, 3975275337, 864674487, 2076190208...
258
    (847957139, 2591432844, 2246699815, 3304582332...
                       mol2vec Clusters
     (300,) dimensional vector
72
                                       33
258 (300,) dimensional vector
                                       33
First 2 entries for cluster: 34
                                               Drug \
                       CC(C)NCC(0)COc1cccc2cccc12
170
371 COc1cc2c(Nc3ccc(Br)cc3F)ncnc2cc1OCC1CCN(C)CC1
                                                 Target \
170 MGAGVLVLGASEPGNLSSAAPLPDGAATAARLLVPASPPASLLPPA...
371 MSSPRAVVQLGKAQPAGEELATANQTAQQPSSPAMRRLTVDDFEIG...
170 <img data-content="rdkit/molecule" src="data:i...
371 <img data-content="rdkit/molecule" src="data:i...
```

170 371	Sentence (2246728737, 3537119515, 2245273601, 263530394 (2246728737, 3975275337, 864674487, 2076190208	\
371	mol2vec Clusters (300,) dimensional vector 34 (300,) dimensional vector 34 t 2 entries for cluster: 35	
88 285	Drug COc1cc2c(N3CCN(C(=0)Nc4ccc(OC(C)C)cc4)CC3)ncnc C[C@@H](NC(=0)CCCCCNC(=0)[C@H]10[C@@H](n2cnc3c	\
88 285	Target MRGARGAWDFLCVLLLLLRVQTGSSQPSVSPGEPSPPSIHPGKSDL MSRPPPTGKMPGAPETAPGDGAGASRQRKLEALIRDPRSPINVESL	\
88 285	Mol	

mol2vec Clusters

```
107 (300,) dimensional vector
                                       36
365 (300,) dimensional vector
                                       36
First 2 entries for cluster: 37
                                                   Drug \
         O=S(=0)(NCCNC/C=C/c1ccc(Br)cc1)c1cccc2cnccc12
255
341
     CN1CCN(c2ccc3nc(-c4c(N)c5c(F)cccc5[nH]c4=0)[nH...
                                                 Target \
255 MGNAAAAKKGSEQESVKEFLAKAKEDFLKKWETPSQNTAQLDQFDR...
341 MGAIGLLWLLPLLLSTAAVGSGMGTGQRAGSPAAGPPLQPREPLSY...
                                                    Mol \
255
     <img data-content="rdkit/molecule" src="data:i...</pre>
     <img data-content="rdkit/molecule" src="data:i...</pre>
                                               Sentence \
255 (864942730, 2228063684, 999334238, 288315894, ...
341
    (2246728737, 3657471097, 2092489639, 202181243...
                       mol2vec Clusters
255 (300,) dimensional vector
341 (300,) dimensional vector
First 2 entries for cluster: 38
115 CO[C@@H] 10[C@H] (CO) [C@@H] (O[C@@H] 20[C@H] (CO) [C...
355 CCN(CC)CCNC(=0)c1c(C)[nH]c(/C=C2\C(=0)Nc3ccc(F...
                                                 Target \
115 MADNFSLHDALSGSGNPNPQGWPGAWGNQPAGAGGYPGASYPGAYP...
355 MDRSKENCISGPVKATAPVGGPKRVLVTQQFPCQNPLPVNSGQAQR....
                                                    Mol \
115 <img data-content="rdkit/molecule" src="data:i...
355
     <img data-content="rdkit/molecule" src="data:i...</pre>
115 (2246728737, 3975275337, 864674487, 1978844073...
355 (2246728737, 3542456614, 2245384272, 592593828...
                       mol2vec Clusters
115 (300,) dimensional vector
355 (300,) dimensional vector
                                       38
First 2 entries for cluster: 39
                                                   Drug \
23
     CN[COOH](C)C(=O)N[COH](C(=O)N1CCC[COH]1C(=O)N[...
```

319	COCCNC(=0) [C@@H] 1CCCN1C(=0) [C@H] (N) Cc1ccc(C1) cc1	
23 319	Target MSDAVSSDRNFPNSTNLPRNPSMADYEARIFTFGTWIYSVNKEQLA MAHVRGLQLPGCLALAALCSLVHSQHVFLAPQQARSLLQRVRRANT	\
23 319	Mol	

```
Mol \
124 <img data-content="rdkit/molecule" src="data:i...
397 <img data-content="rdkit/molecule" src="data:i...
                                               Sentence \
    (2246728737, 3975275337, 864674487, 1978844073...
124
397
    (2246728737, 3542456614, 2245384272, 225184566...
                       mol2vec Clusters
124 (300,) dimensional vector
397 (300,) dimensional vector
                                       41
First 2 entries for cluster: 42
                                                   Drug \
102 CO[C@@H]10[C@H](CO)[C@@H](O[C@@H]20[C@H](CO)[C...
281 NC(=0) [C@@H] (CCCN=C(N)N)NC(=0)CCCCCNC(=0) [C@H]...
                                                 Target \
102 MACGLVASNLNLKPGECLRVRGEVAPDAKSFVLNLGKDSNNLCLHF...
281 MSRPPPTGKMPGAPETAPGDGAGASRQRKLEALIRDPRSPINVESL...
                                                    Mol \
102 <img data-content="rdkit/molecule" src="data:i...
281 <img data-content="rdkit/molecule" src="data:i...
                                               Sentence \
102 (2246728737, 3975275337, 864674487, 1978844073...
281 (847957139, 2591432844, 2246699815, 3304582332...
                       mol2vec Clusters
102 (300,) dimensional vector
                                       42
281 (300,) dimensional vector
                                       42
First 2 entries for cluster: 43
103 CO[C@@H] 10 [C@H] (CO) [C@@H] (O [C@@H] 20 [C@H] (CO) [C...
273 NCCCC[C@0H](NC(=0)CCCCCNC(=0)[C0H]10[C00H](n2c...
                                                 Target \
103 MACGLVASNLNLKPGECLRVRGEVAPDAKSFVLNLGKDSNNLCLHF...
273 MGNAAAAKKGSEQESVKEFLAKAKEDFLKKWETPSQNTAQLDQFDR...
103 <img data-content="rdkit/molecule" src="data:i...
273 <img data-content="rdkit/molecule" src="data:i...
                                               Sentence \
103 (2246728737, 3975275337, 864674487, 1978844073...
```

273 (847957139, 2592785365, 2245384272, 787341104,	
mol2vec Clusters  103 (300,) dimensional vector 43  273 (300,) dimensional vector 43  First 2 entries for cluster: 44	
Drug \ 204	
Target 204 MAPWPHENSSLAPWPDLPTLAPNTANTSGLPGVPWEAALAGALLAL 346 MGAIGLLWLLPLLLSTAAVGSGMGTGQRAGSPAAGPPLQPREPLSY	\
Mol 204	

Drug  144 CS[C@@H]10[C@H](CO)[C@H](D)[C@H](NC(=0)c2ccc(C  173 Cc1ccc(C1)c(OCC(0)CNC(C)(C)C)c1	\
Target 144 MADNFSLHDALSGSGNPNPQGWPGAWGNQPAGAGGYPGASYPGAYP 173 MGAGVLVLGASEPGNLSSAAPLPDGAATAARLLVPASPPASLLPPA	\
Mol  144	

```
25
         MSDAVSSDRNFPNSTNLPRNPSMADYEARIFTFGTWIYSVNKEQLA...
    348 MGAIGLLWLLPLLLSTAAVGSGMGTGQRAGSPAAGPPLQPREPLSY...
                                                         Mol \
    25
         <img data-content="rdkit/molecule" src="data:i...</pre>
    348
         <img data-content="rdkit/molecule" src="data:i...</pre>
                                                    Sentence \
    25
         (2246728737, 3537119515, 2245273601, 900670219...
    348 (2246728737, 3824063894, 847961216, 1732628033...
                            mol2vec Clusters
    25
         (300,) dimensional vector
    348 (300,) dimensional vector
                                            48
    First 2 entries for cluster: 49
                                                        Drug \
    104 CD[C@@H]10[C@H](CD)[C@@H](D[C@@H]20[C@H](CD)[C...
    333
                 C#Cc1cccc(Nc2ncnc3cc(OCCOC)c(OCCOC)cc23)c1
                                                      Target \
    104 MACGLVASNLNLKPGECLRVRGEVAPDAKSFVLNLGKDSNNLCLHF...
    333 MLEICLKLVGCKSKKGLSSSSSCYLEEALQRPVASDFEPQGLSEAA...
                                                         Mol \
    104
         <img data-content="rdkit/molecule" src="data:i...</pre>
         <img data-content="rdkit/molecule" src="data:i...</pre>
    333
    104
         (2246728737, 3975275337, 864674487, 1978844073...
    333
         (2245897107, 3492293582, 2245900962, 189948681...
                            mol2vec Clusters
    104 (300,) dimensional vector
                                            49
    333 (300,) dimensional vector
                                            49
[]:
```

29