```
In [1]:
      import os
      import matplotlib.pyplot as plt
      from mpl_toolkits.mplot3d import Axes3D
      import numpy as np
      import pandas as pd
      %matplotlib inline
      from time import time
      from sklearn import metrics
      from sklearn.cluster import KMeans
      from sklearn import metrics
      from sklearn.cluster import DBSCAN
      from sklearn.preprocessing import StandardScaler, MaxAbsScaler, Normalizer
      from sklearn.model selection import RandomizedSearchCV
      from trackml.dataset import load_event, load_dataset
      from trackml.score import score_event
      from scipy import spatial
In [2]: path to train = "/home/cameron/Documents/Computational_Physics/train_1"
In [3]: event prefix = "event000001000"
In [4]: hits, cells, particles, truth = load_event(os.path.join(path_to_train, event_prefix))
In [5]: hits.head()
                     x y z volume_id layer_id module_id
                -64.409897 -7.163700 -1502.5 7
                                              2
         1 2
               -55.336102 0.635342 -1502.5 7
         2 3
               -83.830498 -1.143010 -1502.5 7
                                              2
                                                     1
         3 4
                -96.109100 -8.241030 -1502.5 7
                                              2
         4 5
                -62.673599 -9.371200 -1502.5 7
                                              2
```

11/3/2018

```
TrackML
In [6]:
       fig = plt.figure(figsize=(20,7))
        ax = fig.add_subplot(122,projection='3d')
        x = hits['x']
        x1 = x[::100]
        y = hits['y']
        y1 = y[::100]
        z = hits['z']
        z1 = z[::100]
        ax.scatter(x1,y1,z1)
        ax.set_xlabel('z (mm)')
        ax.set_ylabel('x (mm)')
        ax.set_zlabel('y (mm)')
        ax.set_title("Hits", y=-.15, size=20)
        plt.show()
                                                                     3000
                                                                     2000
                                                                     1000
                                                                      ق ٥
                                                                    -1000
                                                                    -2000
                                                                    -3000
                                                              1000
750
500
0
                                                     250
-250
-500
-750
00
                -1000<sub>-750</sub>-500<sub>-250</sub> 0
                             z (mm) 250 500
                                         750 <sub>1000</sub>
                                                   -1000
                                       Hits
```

In [7]:	cells.head()

	hit_id	ch0	ch1	value
0	1	209	617	0.013832
1	1	210	617	0.079887
2	1	209	618	0.211723
3	2	68	446	0.334087
4	3	58	954	0.034005

```
In [8]:
        particles.head()
                    particle_id
                                                                                       pz q nhits
                                                        VZ
           0 4503668346847232 -0.009288 0.009861
                                                 -0.077879
                                                            -0.055269
            1 4503737066323968 -0.009288 0.009861 -0.077879 -0.948125 0.470892
                                                                                 2.010060
            2 4503805785800704 -0.009288 0.009861 -0.077879 -0.886484 0.105749
                                                                                 0.683881
            3 4503874505277440 -0.009288 0.009861 -0.077879 0.257539
                                                                      -0.676718
                                                                                0.991616
            4 4503943224754176 -0.009288 0.009861 -0.077879 16.439400 -15.548900 -39.824902 1 3
```

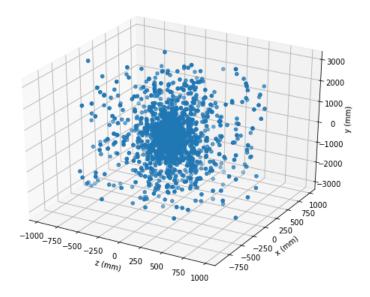
```
In [9]: fig = plt.figure(figsize=(20,7))
    ax = fig.add_subplot(122,projection='3d')

x = particles['vx']
    x1 = x[::10]
    y = particles['vy']
    y1 = y[::10]
    z = particles['vz']
    z1 = z[::10]

ax.scatter(x,y,z)

ax.set_xlabel('z (mm)')
    ax.set_ylabel('x (mm)')
    ax.set_zlabel('y (mm)')
    ax.set_title("Particles", y=-.15, size=20)

plt.show()
```



Particles

In [10]: truth.head()

	hit_id	particle_id	tx	ty	tz	tpx	tpy	tpz	weight
(1	0	-64.411598	-7.164120	-1502.5	250710.000000	-149908.000000	-956385.00000	0.000000
1	. 2	22525763437723648	-55.338501	0.630805	-1502.5	-0.570605	0.028390	-15.49220	0.000010
2	3	0	-83.828003	-1.145580	-1502.5	626295.000000	-169767.000000	-760877.00000	0.000000
3	4	297237712845406208	-96.122902	-8.230360	-1502.5	-0.225235	-0.050968	-3.70232	0.000008
4	5	418835796137607168	-62.659401	-9.375040	-1502.5	-0.281806	-0.023487	-6.57318	0.000009

```
In [11]:
        #Plot from Joshua Bonatt
        tracks = truth.particle_id.unique()[1::100]
        fig = plt.figure(figsize=(20,7))
        ax2 = fig.add_subplot(122,projection='3d')
        for track in tracks:
            hit_ids = truth[truth['particle_id'] == track]['hit_id']
            t = hits[hits['hit_id'].isin(hit_ids)][['x', 'y', 'z']]
            ax2.plot3D(t.z, t.x, t.y, '.-', ms=10)
        ax2.set_xlabel('z (mm)')
        ax2.set_ylabel('x (mm)')
        ax2.set_zlabel('y (mm)')
        ax2.set_title("Particle Tracks", y=-.15, size=20)
        plt.show()
                                                                 1000
                                                                 750
                                                                 500
                                                                 250
                                                                -250
                                                                -500
                                                                -750
                                                                -1000
                                                          1000
750
500
                                                       250
                -3000 <sub>-2000</sub> <sub>-1000</sub>
                                                    -250 ⊀(mm)
-500 ⊀(mm)
                           z (mm)
                                 1000
                                                  -750
                                      2000
                                               -1000
                               Particle Tracks
```

```
In [12]:
       #Based of of code from Mikhail Hushchyn
       class Clusterer(object):
           def __init__(self, eps):
               self.eps = eps
           def preprocess(self, hits):
               x = hits.x.values
               y = hits.y.values
               z = hits.z.values
               r = np.sqrt(x**2 + y**2 + z**2)
               hits['x2'] = x/r
               hits['y2'] = y/r
               r = np.sqrt(x**2 + y**2)
               hits['z2'] = z/r
               ss = StandardScaler()
               X = ss.fit_transform(hits[['x2', 'y2', 'z2']].values)
               return X
           def predict(self, hits):
               X = self. preprocess(hits)
               clf = DBSCAN(eps=self.eps, min samples=1, algorithm='auto', n jobs=-1)
               labels = clf.fit_predict(X)
               return labels
In [13]:
       model = Clusterer(eps=0.00738)
       labels = model.predict(hits)
In [ ]:
In [14]:
       def create_one_event_submission(event_id, hits, labels):
           sub data = np.column stack(([event id]*len(hits), hits.hit id.values, labels))
           submission = pd.DataFrame(data=sub data, columns=["event id", "hit id", "track id"])
       .astype(int)
           return submission
In [15]:
       submission = create_one_event_submission(0, hits, labels)
```

```
In [16]:
       #Alternative scoring function from CPMP
       def score event fast(truth, submission):
           truth = truth[['hit_id', 'particle_id', 'weight']].merge(submission, how='left', on=
       'hit_id')
           df = truth.groupby(['track id', 'particle id']).hit id.count().to frame('count both'
       ).reset index()
           truth = truth.merge(df, how='left', on=['track_id', 'particle_id'])
           df1 = df.groupby(['particle id']).count both.sum().to frame('count particle').reset
       index()
           truth = truth.merge(df1, how='left', on='particle_id')
           df1 = df.groupby(['track id']).count both.sum().to frame('count track').reset index
       ()
           truth = truth.merge(df1, how='left', on='track id')
           truth.count both *= 2
           score = truth[(truth.count_both > truth.count_particle) & (truth.count_both > truth.
       count_track)].weight.sum()
           return score
In [17]: | score = score_event_fast(truth, submission)
       print("Your score: ", score)
       Your score: 0.20306711
```