

```
In [562]: import numpy as np

import matplotlib.pyplot as plt
from mpl_toolkits.mplot3d import Axes3D
import os
import pythreejs
```

пример чтения .pcd и визуализации с помощью open3d

```
In [563]: import open3d as o3d
```

```
In [84]: pcd_load = o3d.io.read_point_cloud("data_1\\0000000006.pcd")
xyz_load = np.asarray(pcd_load.points)
```

```
In [85]: o3d.visualization.draw_geometries([pcd_load])
        # convert Open3D.o3d.geometry.PointCloud to numpy array
print('xyz_load')
print(xyz_load)
```

```
xyz_load
[[ 77.1309967   7.21600008  2.829          ]
 [ 77.10199738  7.45699978  2.82800007]
 [ 76.58599854  8.01500034  2.81299996]
 ...
 [  3.75         -1.41199994 -1.75300002]
 [  3.74600005  -1.39699996 -1.74800003]
 [  0.           0.           0.           ]]
```

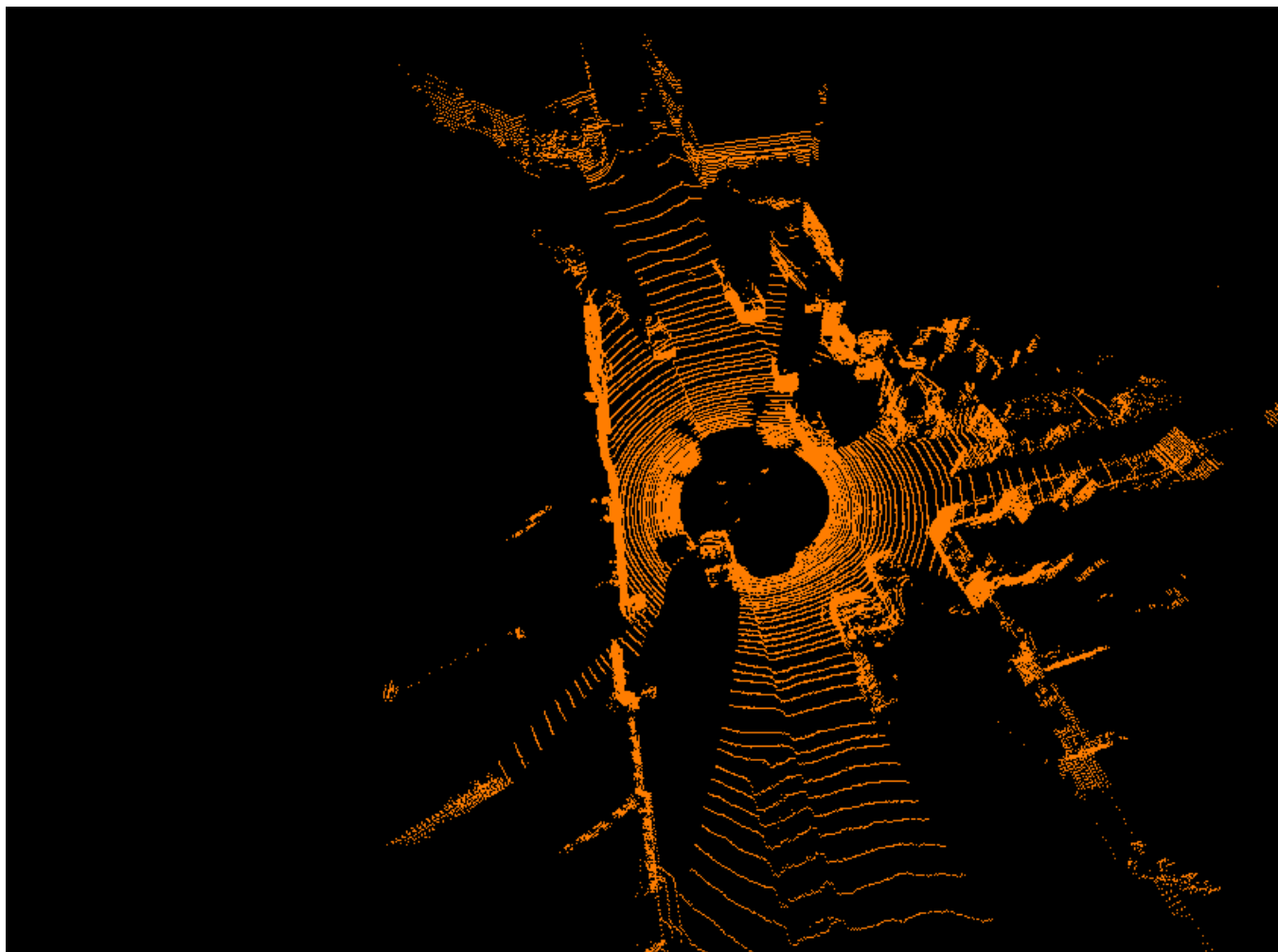
Пример чтения .pcd и визуализации с помощью pyntcloud

```
In [5]: import pyntcloud
import importlib
pyntcloud = importlib.reload(pyntcloud)
# from pyntcloud import PyntCloud
```

```
In [565]: test_cloud = pyntcloud.PyntCloud.from_file("data_1\\0000000002.pcd")
test_cloud
```

```
Out[565]: PyntCloud
116651 points with 1 scalar fields
0 faces in mesh
0 kdrees
0 voxelgrids
Centroid: -0.6957642436027527, 1.0117207765579224, -1.059058427810669
Other attributes:
```

```
In [566]: # pythreejs надо установить с помощью pip а потом активировать в jupyter , загрузили
test_cloud.plot(backend='pythreejs')
```



Point ...

0.00

Background ...



In []:

Дальше я пытаюсь в пайплайн

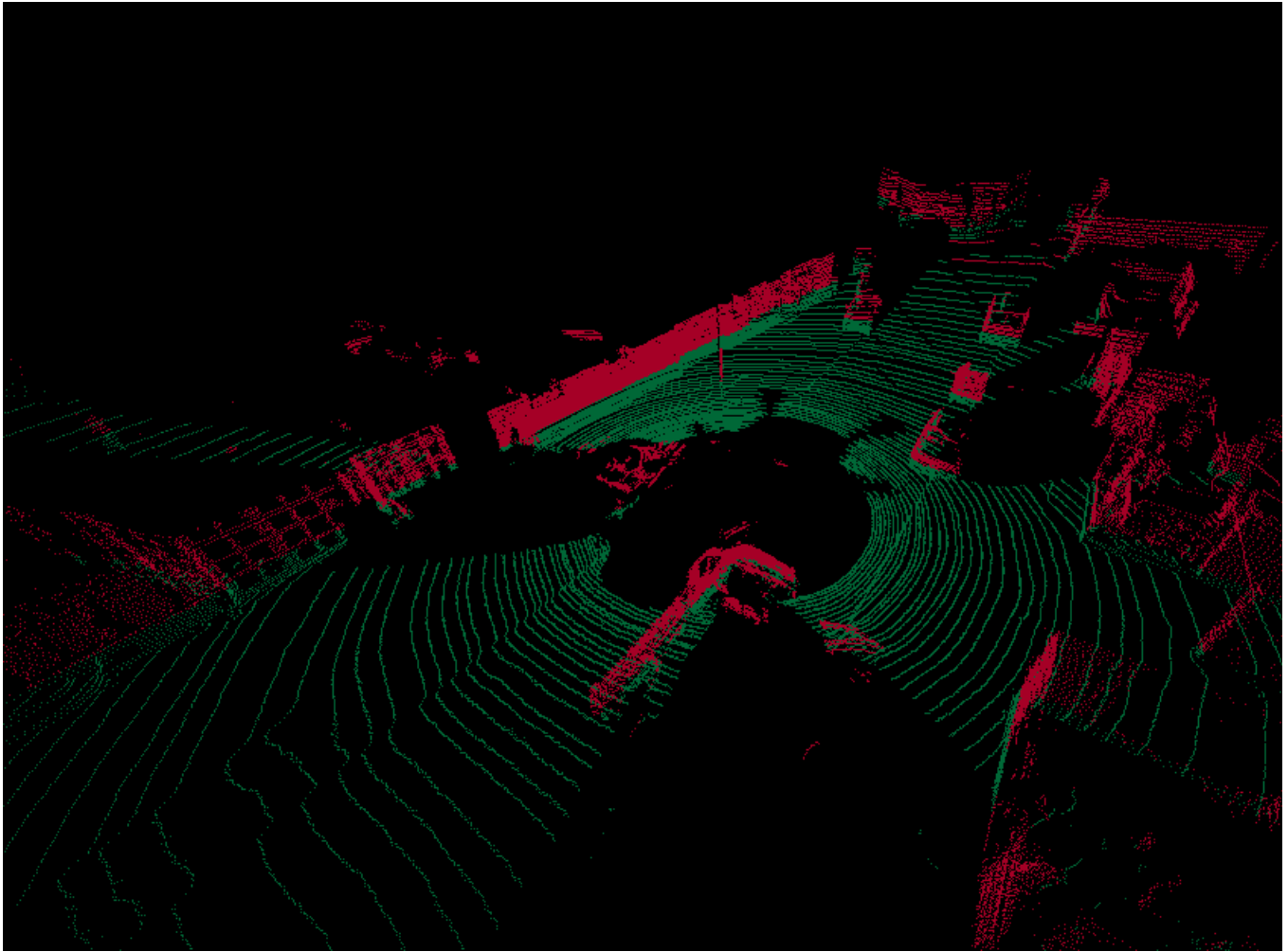
```
In [535]: cloud = pyntcloud.PyntCloud.from_file("data_1\\0000000005.pcd")
```

```
In [536]: cloud.xyz.shape
```

```
Out[536]: (114969, 3)
```

```
In [567]: # фильтр пола дороги, надо убрать чтобы потом искались норм кластеры, иначе будет
is_floor = cloud.add_scalar_field("plane_fit",max_dist=0.55, max_iterations=200,
                                   n_inliers_to_stop=len(cloud.points))
```

```
In [538]: cloud.plot(use_as_color=is_floor, cmap="RdYlGn", output_name="is_floor")
```



Point ...

0.00

Background ...

black



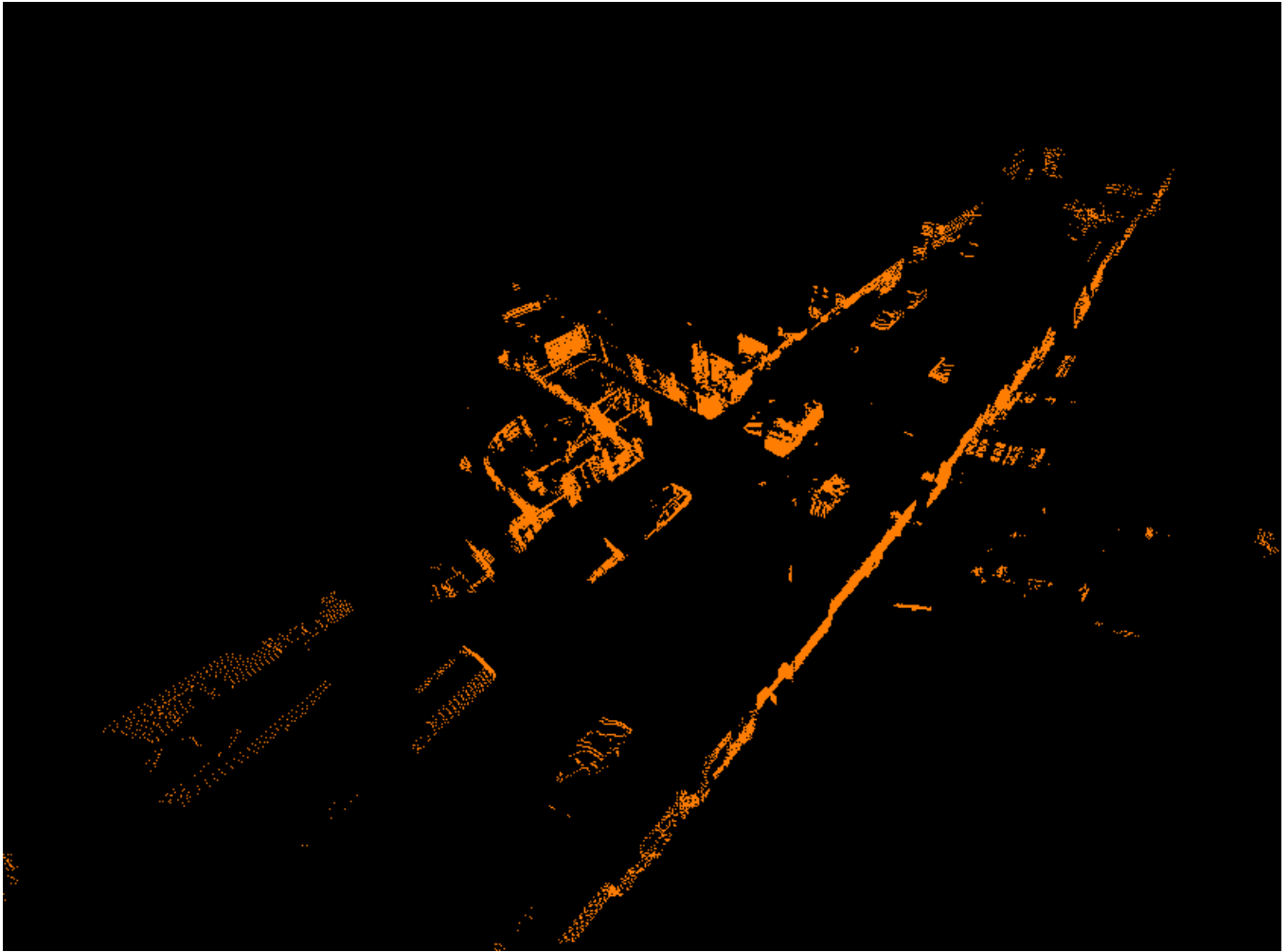
```
In [539]: not_floor = cloud.points[is_floor] != 1
```

```
In [540]: cloud.apply_filter(not_floor)
```

```
In [541]: cloud.xyz.shape
```

```
Out[541]: (53596, 3)
```

```
In [542]: cloud.plot()
```



Point ...

0.00

Background ...

black



от запуска ячейки ниже ничего не меняется

```
In [543]: # есть пример работы KD TREE , как это влияет на кластеризацию?-пока походу никак,
kdtree_id = cloud.add_structure("kdtree", leafsize = 10)

# в гайде ее используют для K соседей, нужны ли они нам???...
k_neighbors = cloud.get_neighbors(k=50, kdtree=kdtree_id)
# scalar_fields
ev = cloud.add_scalar_field("eigen_values", k_neighbors=k_neighbors)
```

In []:

In [462]: *# продолжаем пайплайн*
cloud

Out[462]: PyntCloud
33016 points with 2 scalar fields
0 faces in mesh
1 kdtrees
0 voxelgrids
Centroid: -2.1837236881256104, 0.7934628129005432, -0.10891569405794144
Other attributes:

In [544]: *# можно образовать дорогу по оси x и возможно вообще по любой оси, это как минимум n*
число ненужных точек и хоть как-то ускорить кластеризацию
f = cloud.get_filter("BBOX", min_x=-35, max_x=30)

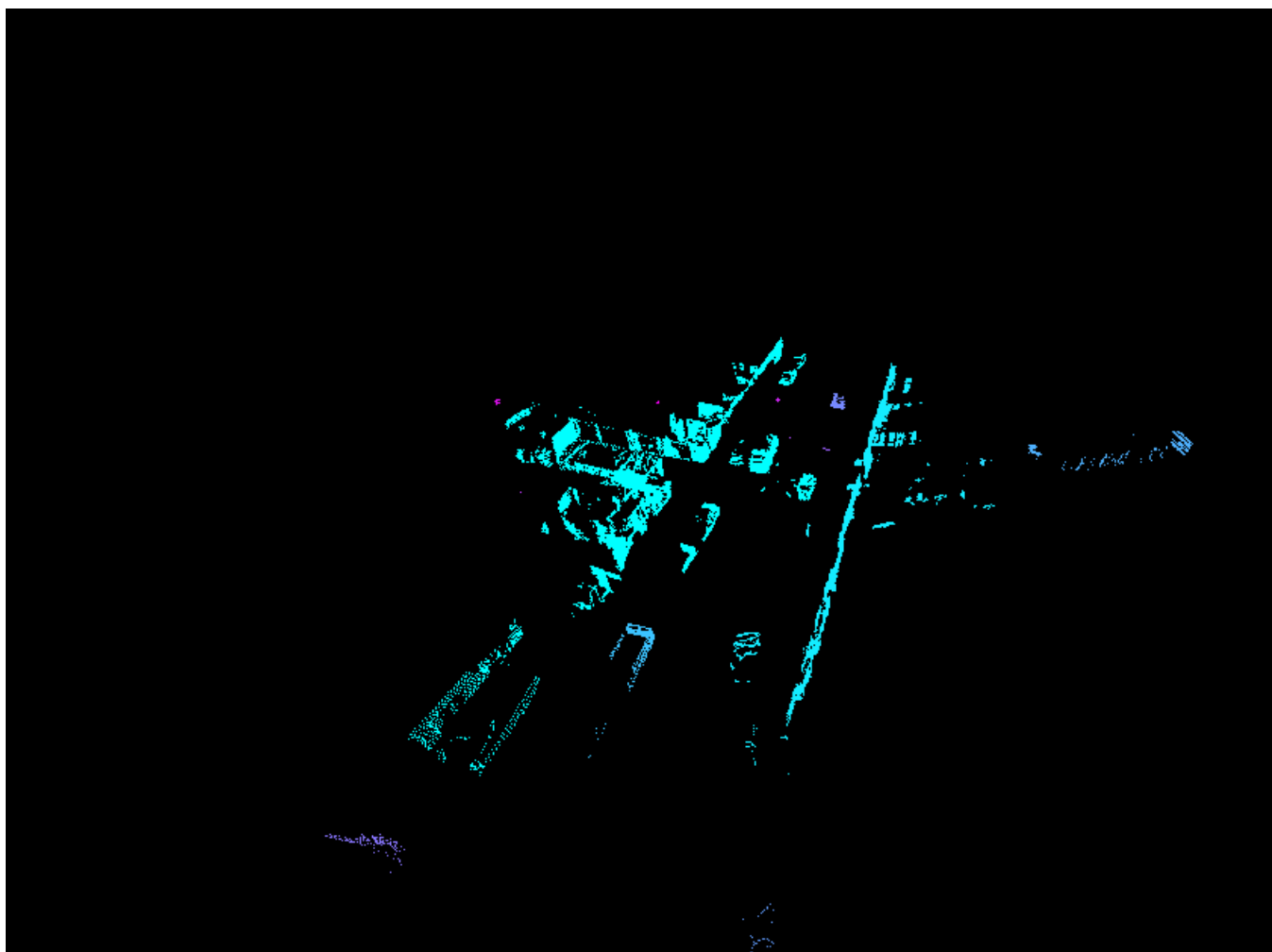
In [546]: cloud.apply_filter(f)

In [571]: *# вокселизируем на 40 вокселей по каждой оси, т.е. будет всего 40*40*40 кубов , в*
чем больше вокселей тем точнее кластеризируется и тем медленнее работает кластери
n_voxels = 40
voxelgrid_id = cloud.add_structure("voxelgrid", n_x=n_voxels, n_y=n_voxels, n_z=n_voxels)

In [578]: *# вот она кластеризация, хромая да хоть какая...*
%time cluster_id = cloud.add_scalar_field("euclidean_clusters", voxelgrid_id=voxelgrid_id)

Wall time: 18.5 s

```
In [577]: # визуализируем ее результаты  
cloud.plot(use_as_color=cluster_id, cmap="cool")
```



Point ...

0.00

Background ...

black



```
In [582]: voxel_grid = cloud.structures['V([40, 40, 40],[None, None, None],True)']
```

```
In [595]: voxel_grid.shape
```

```
Out[595]: [1.7770000457763673, 1.7770000457763673, 1.7770000457763673]
```

```
In [597]: # С*КА Я ПОЛТАРА ЧАСА ИСКАЛ КУДА ЭТИ КЛАСТЕРЫ СОХРАНЯЮТСЯ ПРИКИНЬ!!!!
cloud.points
```

```
Out[597]:
```

| | x | y | z | intensity | is_plane | clusters(V([35, 35, 35], [None, None, None],True)) | clusters(V([40, 40, 40], [None, None, None],True)) |
|-------|-----------|--------|--------|-----------|----------|---|---|
| 0 | 29.785999 | 8.353 | 1.255 | 0.33 | 0 | 0.0 | 2.0 |
| 1 | 29.466999 | 8.363 | 1.245 | 0.35 | 0 | 0.0 | 2.0 |
| 2 | 29.150999 | 8.372 | 1.235 | 0.33 | 0 | 0.0 | 2.0 |
| 3 | 28.846001 | 8.333 | 1.224 | 0.35 | 0 | 0.0 | 2.0 |
| 4 | 28.551001 | 8.345 | 1.215 | 0.35 | 0 | 0.0 | 2.0 |
| ... | ... | ... | ... | ... | ... | ... | ... |
| 50537 | 1.564000 | -1.124 | -0.782 | 0.00 | 1 | 0.0 | 2.0 |
| 50538 | 1.502000 | -1.071 | -0.744 | 0.00 | 1 | 0.0 | 2.0 |
| 50539 | 1.508000 | -1.072 | -0.747 | 0.00 | 1 | 0.0 | 2.0 |
| 50540 | 1.441000 | -0.979 | -0.696 | 0.00 | 1 | 0.0 | 2.0 |
| 50541 | 0.000000 | 0.000 | 0.000 | 0.00 | 1 | 0.0 | 2.0 |

50542 rows × 7 columns

**все что ниже осталось от PCL, так как это изначально PCK
ноутбук с примером,**

там пайплайн заветный

```
In [100]: cloud_x = cloud_np[:, 0]
cloud_y = cloud_np[:, 1]
cloud_z = cloud_np[:, 2]

x_max, x_min = np.max(cloud_x), np.min(cloud_x)
y_max, y_min = np.max(cloud_y), np.min(cloud_y)
z_max, z_min = np.max(cloud_z), np.min(cloud_z)

print('x_max: ', x_max, ', x_min: ', x_min)
print('y_max: ', y_max, ', y_min: ', y_min)
print('z_max: ', z_max, ', z_min: ', z_min)
print('Number of points: ', cloud_np.shape)

x_max: 249 , x_min: 0
y_max: 180 , y_min: 69
z_max: 148 , z_min: 101
Number of points: (5185, 3)
```

```
In [17]: # cloud_XYZ = pcl.PointCloud()
# cloud_XYZ.from_array(cloud_np[:, 0:3])
```

```
In [101]: colors = {
    'Car': 'b',
    'Tram': 'r',
    'Cyclist': 'g',
    'Van': 'c',
    'Truck': 'm',
    'Pedestrian': 'y',
    'Sitter': 'k'
}
axes_limits = [
    [int(x_min*1.2), int(x_max*1.2)], # X axis range
    [int(y_min*1.2), int(y_max*1.2)], # Y axis range
    [-5, 5] # Z axis range
]
```

```
In [102]: axes_str = ['X', 'Y', 'Z']
```

```
In [103]: def draw_box(pyplot_axis, vertices, axes=[0, 1, 2], color='red'):
    """
    Draws a bounding 3D box in a pyplot axis.

    Parameters
    -----
    pyplot_axis : Pyplot axis to draw in.
    vertices     : Array 8 box vertices containing x, y, z coordinates.
    axes         : Axes to use. Defaults to `[0, 1, 2]`, e.g. x, y and z axes.
    color        : Drawing color. Defaults to `black`.
    """
    vertices = vertices[axes, :]
    connections = [
        [0, 1], [1, 2], [2, 3], [3, 0], # Lower plane parallel to Z=0 plane
        [4, 5], [5, 6], [6, 7], [7, 4], # Upper plane parallel to Z=0 plane
        [0, 4], [1, 5], [2, 6], [3, 7] # Connections between upper and lower plan
    ]
    for connection in connections:
        pyplot_axis.plot(*vertices[:, connection], c=color, lw=0.5)
```



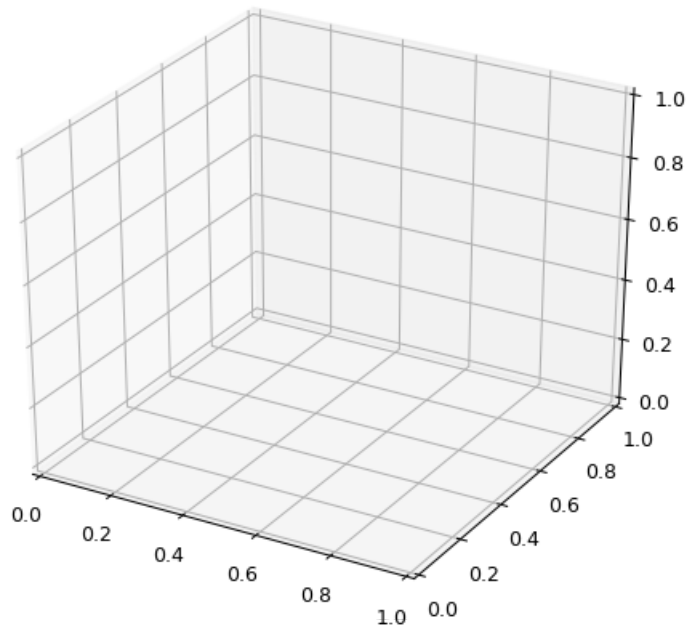
```

In [127]: 1 def draw_point_cloud(cloud, ax, title, axes=[0, 1, 2], xlim3d=None, ylim3d=None, zlim3d=None):
2
3     cloud = np.array(cloud) # Covert point cloud to numpy array
4     no_points = np.shape(cloud)[0]
5     point_size = 10**(3- int(np.log10(no_points))) # Adjust the point size
6     if np.shape(cloud)[1] == 4: # If point cloud is XYZI format (e.g., I s
7         ax.scatter(*np.transpose(cloud[:, axes]), s = point_size, c=cloud[:, axes[-1]])
8     elif np.shape(cloud)[1] == 3: # If point cloud is XYZ format
9         ax.scatter(*np.transpose(cloud[:, axes]), s = point_size, c='b', a
10    ax.set_xlabel('{} axis'.format(axes_str[axes[0]]))
11    ax.set_ylabel('{} axis'.format(axes_str[axes[1]]))
12    #     if len(axes) > 2: # 3-D plot
13    #         ax.set_xlim3d(axes_limits[axes[0]])
14    #         ax.set_ylim3d(axes_limits[axes[1]])
15    #         ax.set_zlim3d(axes_limits[axes[2]])
16    #         ax.set_zlabel('{} axis'.format(axes_str[axes[2]]))
17    #     else: # 2-D plot
18    #         ax.set_xlim(*axes_limits[axes[0]])
19    #         ax.set_ylim(*axes_limits[axes[1]])
20    # User specified limits
21    if xlim3d!=None:
22        ax.set_xlim3d(xlim3d)
23    if ylim3d!=None:
24        ax.set_ylim3d(ylim3d)
25    if zlim3d!=None:
26        ax.set_zlim3d(zlim3d)
27    ax.set_title(title)

```

```
In [130]: # %matplotlib inline
%matplotlib notebook
f = plt.figure(figsize=(7, 6))
# f = plt.figure()
ax = f.add_subplot(111, projection='3d')
draw_point_cloud(np.unique(test,axis=0), ax, 'Point Cloud', xlim3d=(-80,80))
plt.show()
```

Figure 1



```
-----
IndexError                                Traceback (most recent call last)
<ipython-input-130-89d00a3726cd> in <module>
      4 # f = plt.figure()
      5 ax = f.add_subplot(111, projection='3d')
----> 6 draw_point_cloud(cloud.xyz[f], ax, 'Point Cloud', xlim3d=(-80,80))
      7 plt.show()

IndexError: only integers, slices (:`:`), ellipsis ( `...` ), numpy.newaxis ( `None` ) and integer or boolean arrays are valid indices
```

```
In [82]: import pptk
```

```
In [125]: # v = pptk.viewer(np.unique(test,axis=0))
v = pptk.viewer(cloud.xyz[f])
v.set(point_size=0.05)
```

```
In [70]: # f, ax3 = plt.subplots(3, 1, figsize=(12, 25))
# draw_point_cloud(cloud_np,
#                  ax3[0],
#                  'XZ projection (Y = 0)',
#                  axes=[0, 2] # X and Z axes
#                  )
# draw_point_cloud(cloud_np,
#                  ax3[1],
#                  'XY projection (Z = 0)',
#                  axes=[0, 1] # X and Y axes
#                  )
# draw_point_cloud(cloud_np,
#                  ax3[2],
#                  'YZ projection (X = 0)',
#                  axes=[1, 2] # Y and Z axes
#                  )
# plt.show()
```

```
In [10]: def voxel_filter(cloud, leaf_sizes):
        """
        Input parameters:
        cloud: input point cloud to be filtered
        leaf_sizes: a list of leaf_size for X, Y, Z
        Output:
        cloud_voxel_filtered: voxel-filtered cloud
        """

        sor = cloud.make_voxel_grid_filter()
        size_x, size_y, size_z = leaf_sizes
        sor.set_leaf_size(size_x, size_y, size_z)
        cloud_voxel_filtered = sor.filter()

        return cloud_voxel_filtered
```

```
In [11]: cloud_voxel_filtered = voxel_filter(cloud_XYZ, [0.3, 0.3, 0.3])
print('Input cloud size: ', cloud_XYZ.size, ', size after voxel-filtering: ', cloud_voxel_filtered.size)

Input cloud size: 114396 , size after voxel-filtering: 14230
```

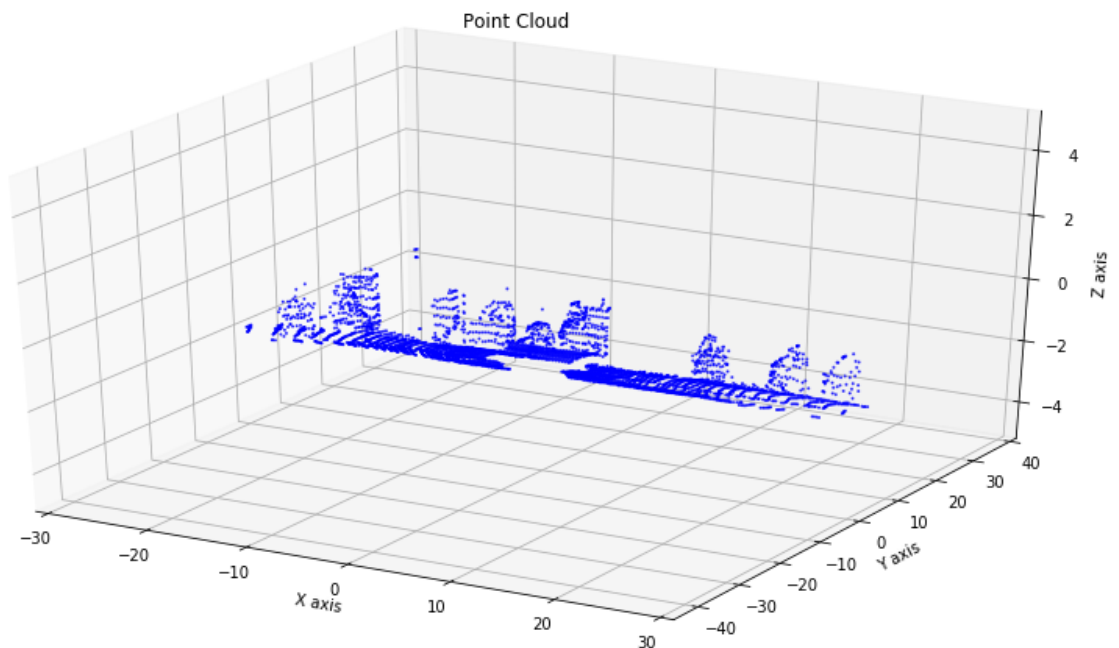
```
In [12]: def roi_filter(cloud, x_roi, y_roi, z_roi):
        """
        Input Parameters:
            cloud: input point cloud
            x_roi: ROI range in X
            y_roi: ROI range in Y
            z_roi: ROI range in Z

        Output:
            ROI region filtered point cloud
        """
        clipper = cloud.make_crobox()
        cloud_roi_filtered= pcl.PointCloud()
        xc_min, xc_max = x_roi
        yc_min, yc_max = y_roi
        zc_min, zc_max = z_roi
        clipper.set_MinMax(xc_min, yc_min, zc_min, 0, xc_max, yc_max, zc_max, 0)
        cloud_roi_filtered =clipper.filter()
        return cloud_roi_filtered
```

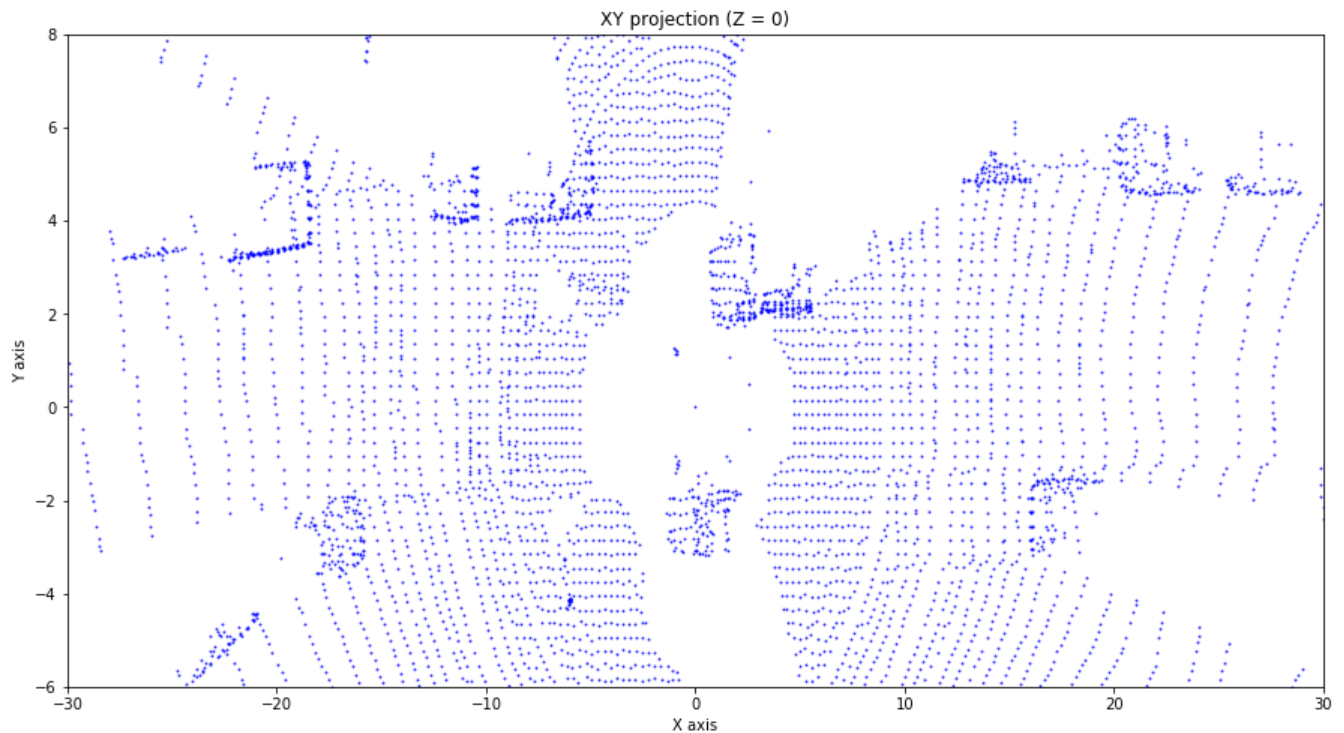
```
In [13]: cloud_roi_filtered = roi_filter(cloud_voxel_filtered, [-30, 30], [-6, 8], [-3, 3])
print('Input cloud size: ', cloud_XYZ.size)
print('Size after voxel-filtering: ', cloud_voxel_filtered.size)
print('Size after ROI filter: ', cloud_roi_filtered.size)
```

```
Input cloud size: 114396
Size after voxel-filtering: 14230
Size after ROI filter: 4531
```

```
In [14]: f = plt.figure(figsize=(15, 8))
ax = f.add_subplot(111, projection='3d')
draw_point_cloud(cloud_roi_filtered, ax, 'Point Cloud', xlim3d=(-30,30))
plt.show()
```



```
In [15]: axes_limits = [
    [-30, 30], # X axis range
    [-6, 8], # Y axis range
    [-3, 3] # Z axis range
]
f = plt.figure(figsize=(15, 8))
ax = f.add_subplot(111)
draw_point_cloud(cloud_roi_filtered,
    ax,
    'XY projection (Z = 0)',
    axes=[0, 1])
plt.show()
```



```
In [16]: def plane_segmentation(cloud, dist_thold, max_iter):
    """
    Input parameters:
        cloud: Input cloud
        dist_thold: distance threshold
        max_iter: maximal number of iteration
    Output:
        indices: list of indices of the PCL points that belongs to the plane
        coefficient: the coefficients of the plane-fitting (e.g., [a, b, c, d] for
    """
    seg = cloud.make_segmenter_normals(ksearch=50) # For simplicity, hard coded
    seg.set_optimize_coefficients(True)
    seg.set_model_type(pcl.SACMODEL_NORMAL_PLANE)
    seg.set_method_type(pcl.SAC_RANSAC)
    seg.set_distance_threshold(dist_thold)
    seg.set_max_iterations(max_iter)
    indices, coefficients = seg.segment()
    return indices, coefficients
```

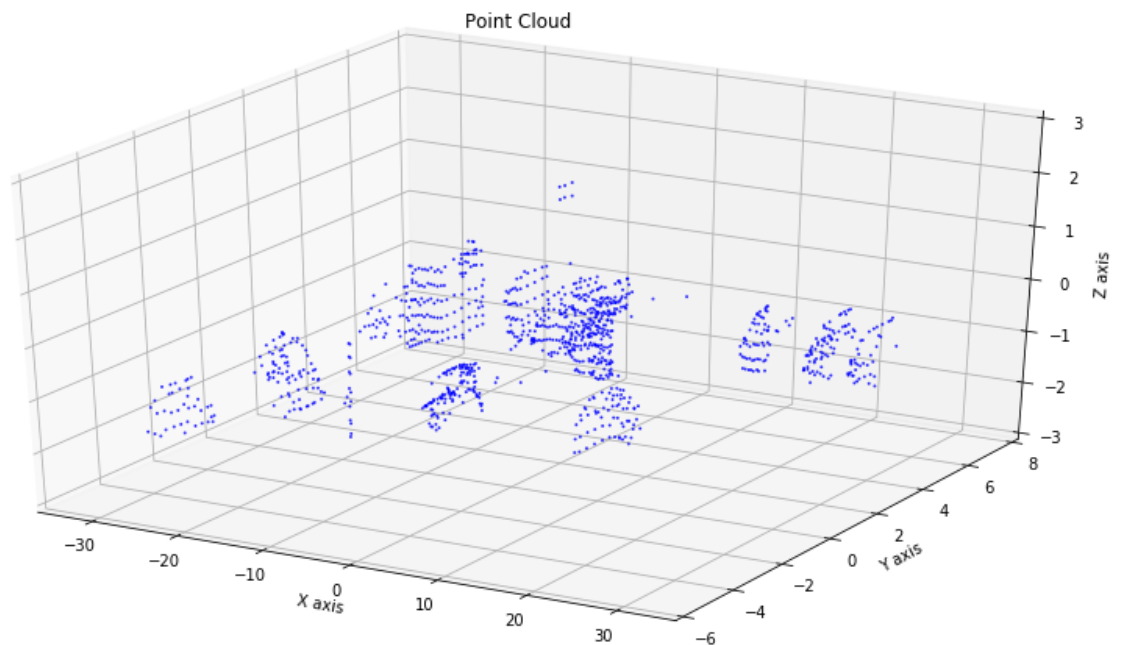
```
In [17]: indices, coefficients = plane_segmentation(cloud_roi_filtered, 0.3, 100)
if len(indices) == 0:
    print('Could not estimate a planar model for the given dataset.')
print('Model coefficients: ' + str(coefficients[0]) + ', ' + str(
    coefficients[1]) + ', ' + str(coefficients[2]) + ', ' + str(coefficients[3])
```

Model coefficients: -0.0030953530222177505, 0.021372323855757713, 0.9997667670249939, 1.7516109943389893

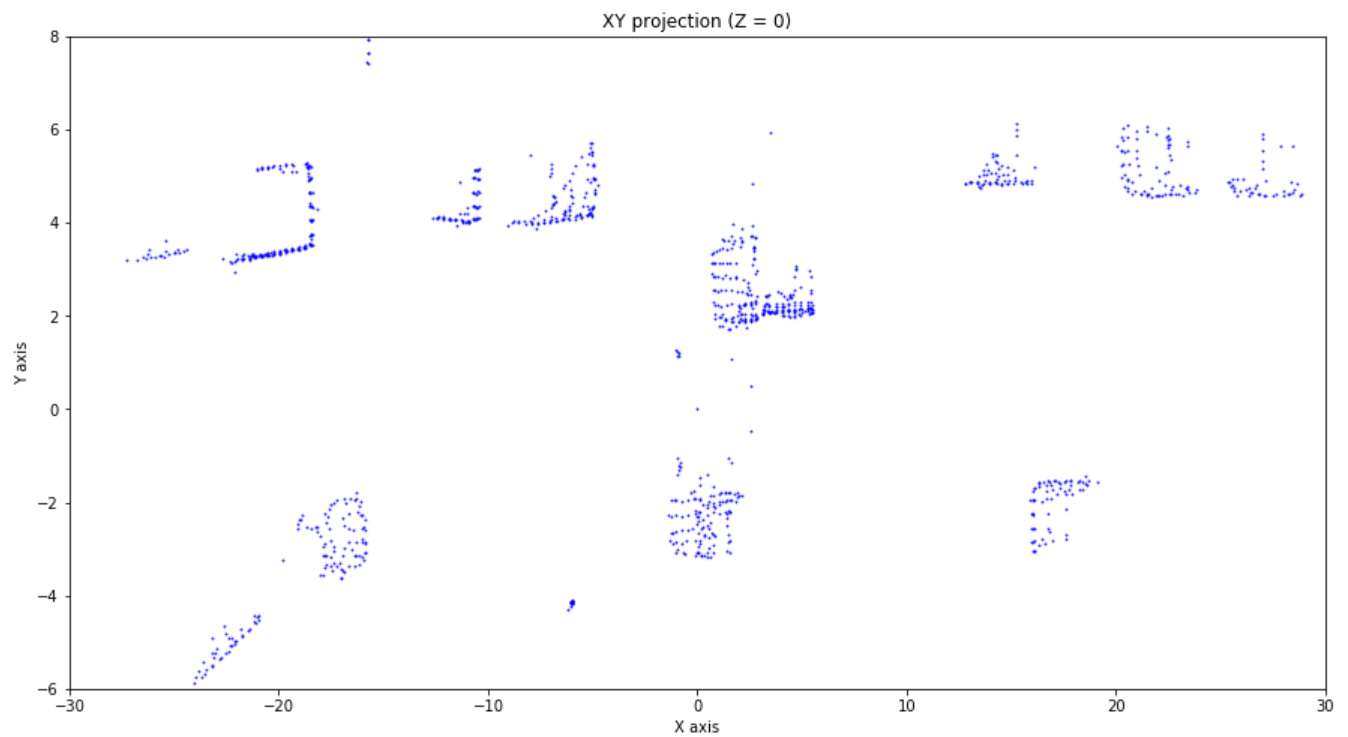
```
In [18]: cloud_plane = cloud_roi_filtered.extract(indices, negative=False)
cloud_obsts = cloud_roi_filtered.extract(indices, negative = True)
print('Size of the plane: ' + str(cloud_plane.size) + ', size of the obstacles: '
```

Size of the plane: 3435, size of the obstacles: 1096

```
In [19]: f = plt.figure(figsize=(15, 8))
ax = f.add_subplot(111, projection='3d')
draw_point_cloud(cloud_obsts, ax, 'Point Cloud', xlim3d=(-35,35))
plt.show()
```



```
In [20]: f = plt.figure(figsize=(15, 8))
ax = f.add_subplot(111)
draw_point_cloud(np.array(cloud_obsts),
                 ax,
                 'XY projection (Z = 0)',
                 axes=[0, 1] # X and Z axes
                 )
plt.show()
```



```
In [27]: def clustering(cloud, tol, min_size, max_size):
        """
        Input parameters:
            cloud: Input cloud
            tol: tolerance
            min_size: minimal number of points to form a cluster
            max_size: maximal number of points that a cluster allows
        Output:
            cluster_indices: a list of list. Each element list contains the indices of
                           the same cluster
        """
        tree = cloud.make_kdtree()
        ec = cloud.make_EuclideanClusterExtraction()
        ec.set_ClusterTolerance(tol)
        ec.set_MinClusterSize(min_size)
        ec.set_MaxClusterSize(max_size)
        ec.set_SearchMethod(tree)
        cluster_indices = ec.Extract()
        return cluster_indices
```

```
In [28]: cluster_indices = clustering(cloud_obsts, 0.7, 30, 400)
```



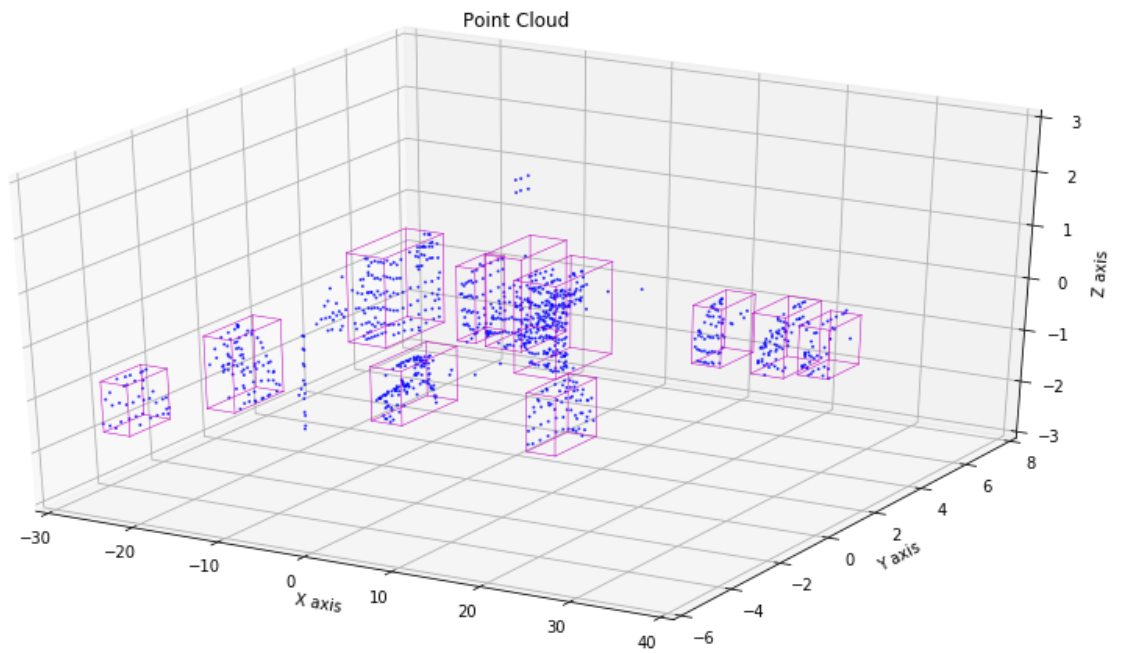
```
In [30]: def get_cluster_box_list(cluster_indices, cloud_obsts):
        """
        Input parameters:
            cluster_indices: a list of list. Each element list contains the indices of
                           the same cluster
            cloud_obsts: PCL for the obstacles
        Output:
            cloud_cluster_list: a list for the PCL clusters: each element is a point c
            box_coord_list: a list of coordinates for bounding boxes
        """
        cloud_cluster_list = []
        box_coord_list = []

        for j, indices in enumerate(cluster_indices):
            points = np.zeros((len(indices), 3), dtype=np.float32)
            for i, indice in enumerate(indices):

                points[i][0] = cloud_obsts[indice][0]
                points[i][1] = cloud_obsts[indice][1]
                points[i][2] = cloud_obsts[indice][2]
            cloud_cluster = pcl.PointCloud()
            cloud_cluster.from_array(points)
            cloud_cluster_list.append(cloud_cluster)
            x_max, x_min = np.max(points[:, 0]), np.min(points[:, 0])
            y_max, y_min = np.max(points[:, 1]), np.min(points[:, 1])
            z_max, z_min = np.max(points[:, 2]), np.min(points[:, 2])
            box = np.zeros([8, 3])
            box[0, :] = [x_min, y_min, z_min]
            box[1, :] = [x_max, y_min, z_min]
            box[2, :] = [x_max, y_max, z_min]
            box[3, :] = [x_min, y_max, z_min]
            box[4, :] = [x_min, y_min, z_max]
            box[5, :] = [x_max, y_min, z_max]
            box[6, :] = [x_max, y_max, z_max]
            box[7, :] = [x_min, y_max, z_max]
            box = np.transpose(box)
            box_coord_list.append(box)
        return cloud_cluster_list, box_coord_list
```

```
In [31]: cloud_cluster_list, box_coord_list = get_cluster_box_list(cluster_indices, cloud_c
```

```
In [33]: f = plt.figure(figsize=(15, 8))
ax = f.add_subplot(111, projection='3d')
draw_point_cloud(cloud_obsts, ax, 'Point Cloud', xlim3d=(-30,40))
for box in box_coord_list:
    draw_box(ax, box, axes=[0, 1, 2], color='m')
plt.show()
```



```
In [34]: f = plt.figure(figsize=(15, 8))
ax = f.add_subplot(111)
draw_point_cloud(np.array(cloud_obsts), ax, 'XY projection (Z = 0)', axes=[0, 1])
for box in box_coord_list:
    draw_box(ax, box, axes=[0, 1], color='m')
plt.show()
```

