

```
In [ ]: #imports and setup
import requests
import pandas as pd
import numpy as np
import json
import matplotlib.pyplot as plt
from mpl_toolkits import mplot3d
from datetime import datetime, timedelta
token = 'FF0D4AB80BDB63716462F02BB9291897'
from functions import *
from process_tests import *
```

I've decided to make the functions in a separate Python file for readability.

Lets start with getting the unique IDs for all participants...

```
In [ ]: listOfParticipantIds(token)
```

```
Out[ ]: ['1', '2', '3', '4', '5', '6', '7', '8', '9', '10', '11']
```

Here we can see that this function gives us back a list of all of the participant IDs in our record. Lets now try to get a general overview of our data by getting the participant ID and type of experiment for each recorded test. The data is by default given in this way, with each test being a separate entry, and its worth noting that the same participant can have multiple entries for the same test.

```
In [ ]: raw = allTestsOverview(token)
# print(raw) #uncomment this to look at the json output
print("Here are all entries in current dataset:")
for r in raw:
    print("Participant ID: "+str(r.get('participant_id'))+", Test Type: "+r.get('test_type').upper)
```

Here are all entries in current dataset:

```
Participant ID: 1, Test Type: DEM
Participant ID: 2, Test Type: DEM
Participant ID: 2, Test Type: RAN
Participant ID: 2, Test Type: RAN
Participant ID: 2, Test Type: GAI
Participant ID: 3, Test Type: DEM
Participant ID: 4, Test Type: DEM
Participant ID: 5, Test Type: DEM
Participant ID: 5, Test Type: RAN
Participant ID: 5, Test Type: RAN
Participant ID: 5, Test Type: GAI
Participant ID: 5, Test Type: TAP
Participant ID: 5, Test Type: PEG
Participant ID: 5, Test Type: PEG
Participant ID: 5, Test Type: TIM
Participant ID: 6, Test Type: DEM
Participant ID: 7, Test Type: DEM
Participant ID: 8, Test Type: DEM
Participant ID: 9, Test Type: DEM
Participant ID: 9, Test Type: RAN
Participant ID: 10, Test Type: DEM
Participant ID: 10, Test Type: RAN
Participant ID: 11, Test Type: DEM
```

We see here that we have categorized the type of test that each entry represents. These three letter shorthands will be standard throughout the experiment.

Lets now start to look at the data. We will start with participant 5 as they have the most entered tests.

```
In [ ]: data = allDataForParticipant(5, token)
print(str(data)[0:3000])
print()
print("Number of Characters in Output: "+str(len(str(data))))
```

```
[{'participant_id': '5', 'redcap_repeat_instrument': '', 'redcap_repeat_instance': '', 'dem_firstname': 'Sam', 'dem_lastname': 'Test', 'dem_zerodate': '', 'dem_code': 'U-N6HNJJUYURXJZ6TD4FTT', 'dem_joindate': '2023-01-13 17:05:18', 'dem_pushids': '["e7uRyDJqTkMuqAob2nZUp0:APA91bFMrg21vVUScPuWrLxQeF-lm26tyG_9MduL15_i00nxcazaZP6koyLLV4gRTToI_aHnBoHF68_tsahfeL4h3gTx9dSFxQHiP8ZpFgfTiREsCYnRRXybhiOmcmgT-4fjL_SA3D2ie"]', 'demographic_complete': '0', 'ran_uuid': '', 'ran_startdate': '', 'ran_enddate': '', 'ran_scheduledate': '', 'ran_status': '', 'ran_supplementaldata': '', 'ran_serializedresult': '', 'ran_flexion': '', 'ran_extension': '', 'ran_devicemotion': '', 'range_of_motion_complete': '', 'gai_uuid': '', 'gai_startdate': '', 'gai_enddate': '', 'gai_scheduledate': '', 'gai_status': '', 'gai_supplementaldata': '', 'gai_serializedresult': '', 'gai_outacc': '', 'gai_outdevice': '', 'gai_returnacc': '', 'gai_returndevice': '', 'gai_restacc': '', 'gai_restdevice': '', 'gai_t_walking_complete': '', 'tap_uuid': '', 'tap_startdate': '', 'tap_enddate': '', 'tap_scheduledate': '', 'tap_status': '', 'tap_supplementaldata': '', 'tap_serializedresult': '', 'tap_leftjson': '', 'tap_leftaccelerometer': '', 'tap_rightjson': '', 'tap_rightaccelerometer': '', 'tapping_complete': '', 'peg_uuid': '', 'peg_startdate': '', 'peg_enddate': '', 'peg_scheduledate': '', 'peg_status': '', 'peg_supplementaldata': '', 'peg_serializedresult': '', 'peg_dom_place': '', 'peg_dom_remove': '', 'peg_nondom_place': '', 'peg_nondom_remove': '', 'peg_test_complete': '', 'tim_uuid': '', 'tim_startdate': '', 'tim_enddate': '', 'tim_scheduledate': '', 'tim_status': '', 'tim_supplementaldata': '', 'tim_serializedresult': '', 'tim_trial1': '', 'tim_turnaround': '', 'tim_trial2': '', 'timed_walk_complete': '', 'tes948_uuid': '', 'tes948_startdate': '', 'tes948_enddate': '', 'tes948_scheduledate': '', 'tes948_status': '', 'tes948_supplementaldata': '', 'tes948_serializedresult': '', 'tes948_json': '', 'test_taks_complete': ''}, {'participant_id': '5', 'redcap_repeat_instrument': 'range_of_motion', 'redcap_repeat_instance': 1, 'dem_firstname': '', 'dem_lastname': '', 'dem_zerodate': '', 'dem_code': '', 'dem_joindate': '', 'dem_pushids': '', 'demographic_complete': '', 'ran_uuid': '76C7FDD9-A151-4017-835A-AB4BB1502F03', 'ran_startdate': '2023-01-13 17:09:59', 'ran_enddate': '2023-01-13 17:10:42', 'ran_scheduledate': '', 'ran_status': '1', 'ran_supplementaldata': '{\n  "devicemanufacturer" : "Apple",\n  "deviceplatform" : "iOS",\n  "syncdate" : "2023-01-13 17:10:42",\n  "configversion" : "1",\n  "deviceuuid" : "AA59EA11-CF26-450E-80E8-853A62FC9221",\n  "deviceversion" : "16.0.2",\n  "appversion" : "2.20.0",\n  "devicemodel" : "iPhone",\n  "percentComplete" : "100%\n}', 'ran_serializedresult': 'result.zip', 'ran_flexion': '', 'ran_extension': '', 'ran_devicemotion': '', 'range_of_motion_complete': '0', 'gai_uuid': '', 'gai_startdate': '', 'gai_enddate': '', 'gai_scheduledate': '', 'gai_status': ''}
```

Number of Characters in Output: 65199

Ok, that looks like its a looot of stuff. Lets focus in on the demographic information for now

```
In [ ]: data = oneTypeOfTestForParticipant(5, 'dem', token)
# print(data) # uncomment to see uncleaned data with extra unused variables.
data = cleanTest(data) # by default this returns the first test in the inputted data.
print(data)
```

```
{'dem_firstname': 'Sam', 'dem_lastname': 'Test', 'dem_zerodate': '', 'dem_code': 'U-N6HNJJUYURXJZ6TD4FTT', 'dem_joindate': '2023-01-13 17:05:18', 'dem_pushids': '["e7uRyDJqTkMuqAob2nZUp0:APA91bFMrg21vVUScPuWrLxQeF-lm26tyG_9MduL15_i00nxcazaZP6koyLLV4gRTToI_aHnBoHF68_tsahfeL4h3gTx9dSFxQHiP8ZpFgfTiREsCYnRRXybhiOmcmgT-4fjL_SA3D2ie"]', 'demographic_complete': '0', 'participant_id': '5'}
```

Beautiful, this is starting to look somewhat nicer. Lets try to see how this works on the easiest to examine test, the peg test. For this participant we also know that two of this type of test was recorded, so lets look at the second test.

```
In [ ]: data = cleanTest(oneTypeOfTestForParticipant(5, 'peg', token)[1])
print(data)
```

```
{'peg_uuid': 'E59C9115-457F-41E8-B3A2-34AB5F1A86A4', 'peg_startdate': '2023-01-29 19:57:29', 'peg_enddate': '2023-01-29 19:59:21', 'peg_scheduledate': '', 'peg_status': '1', 'peg_supplementaldata': '{\n "percentComplete" : "100",\n "syncdate" : "2023-01-29 19:59:21",\n "devicemanufacturer" : "Apple",\n "appversion" : "2.20.0",\n "devicemodel" : "iPhone",\n "configversion" : "4",\n "deviceuuid" : "AA59EA11-CF26-450E-80E8-853A62FC9221",\n "deviceversion" : "16.2",\n "deviceplatform" : "iOS"\n}', 'peg_serializedresult': 'result.zip', 'peg_dom_place': '{"rotated":"false","totalTime":"37.11786541599997","movingDirection":"Left","samples":[{"distance":"242.28302001953125","time":"1.2701712917187251"}, {"distance":"258.8034973144531","time":"7.308940125047229"}, {"distance":"282.5774230957031","time":"2.9633507916587405"}, {"distance":"245.19444274902344","time":"6.510091916657984"}, {"distance":"244.26036071777344","time":"2.8087082499987446"}, {"distance":"239.28343200683594","time":"2.4663711666944437"}, {"distance":"277.4166564941406","time":"4.083882166654803"}, {"distance":"284.65155029296875","time":"7.516064999974333"}, {"distance":"283.39471435546875","time":"2.1979512500111014"}]","threshold":"0.2","totalSuccesses":"9","totalFailures":"9","totalDistance":"2357.8650970458984","dominantHandTested":"true","numberOfPegs":"9"}', 'peg_dom_remove': '{"threshold":"0.2","rotated":"false","totalFailures":"6","totalTime":"23.37469416600012","totalSuccesses":"9","totalDistance":"2758.103271484375","movingDirection":"Right","dominantHandTested":"true","numberOfPegs":"9","samples":[{"distance":"289.8866271972656","time":"4.057453708315734"}, {"distance":"357.08306884765625","time":"2.9833075416390784"}, {"distance":"282.7103271484375","time":"1.6166018333169632"}, {"distance":"303.57916259765625","time":"1.6248125416459516"}, {"distance":"325.55078125","time":"6.991270125028677"}, {"distance":"306.2516174316406","time":"1.4833183749578893"}, {"distance":"299.4362487792969","time":"1.5502688332926482"}, {"distance":"297.2979431152344","time":"1.500050500035286"}, {"distance":"296.3074951171875","time":"1.5580812499974854"}]','peg_nondom_place': '{"totalTime":"19.29132149999998","totalDistance":"2374.449691772461","totalFailures":"1","samples":[{"distance":"251.24652099609375","time":"3.304625541670248"}, {"distance":"251.43414306640625","time":"2.1164832083159126"}, {"distance":"263.5380554199219","time":"2.0833316250354983"}, {"distance":"266.47747802734375","time":"2.009209291660227"}, {"distance":"268.567626953125","time":"1.7485805416363291"}, {"distance":"270.9816589355469","time":"2.2749882916687056"}, {"distance":"268.247314453125","time":"1.74143845832441"}, {"distance":"288.9465637207031","time":"2.0253207499627024"}, {"distance":"245.0103302001953","time":"1.9816290416638367"}]','dominantHandTested':'false','movingDirection':'Right','threshold':'0.2','numberOfPegs':'9','totalSuccesses':'9','rotated':'false'}', 'peg_nondom_remove': '{"threshold":"0.2","rotated":"false","totalFailures":"1","totalTime":"14.759709790999977","totalSuccesses":"9","totalDistance":"2794.0029296875","movingDirection":"Left","dominantHandTested":"false","numberOfPegs":"9","samples":[{"distance":"324.8277282714844","time":"2.4279085416928865"}, {"distance":"291.36102294921875","time":"1.298726000081733"}, {"distance":"312.922119140625","time":"1.2512457916745916"}, {"distance":"324.5309143066406","time":"1.5660187083412893"}, {"distance":"302.01531982421875","time":"1.300726666697301"}, {"distance":"286.5397033691406","time":"1.299611166701652"}, {"distance":"297.3117980957031","time":"1.2830854166531935"}, {"distance":"314.1058654785156","time":"1.3928878750302829"}, {"distance":"340.3884582519531","time":"2.9330882916692644"}]','peg_test_complete': '0', 'participant_id': '5'}
```

2/10/2023

I've been working with a general pattern on the process for how we go about using these tests. Functions will be used in the following manner: get->clean->process with the process part including the downloading and placement of zipped data files. The following cell does all of this for participant 5's Gait Walking test

```
In [ ]: d = process_gai(cleanTest(oneTypeOfTestForParticipant(5,'gai',token)), token)
print(d.keys())
print("# Obs. = "+str(len(pd.json_normalize(d['gai_outacc']))))
df_outdevice = dictListToDF(d['gai_outdevice'])
df_outacc = dictListToDF(d['gai_outacc'])
dictListToDF(d['gai_outdevice']).head()

dict_keys(['gai_uuid', 'gai_startdate', 'gai_enddate', 'gai_scheduledate', 'gai_status', 'gai_supplementaldata', 'gai_serializedresult', 'gai_outacc', 'gai_outdevice', 'gai_returnacc', 'gai_returndevice', 'gai_restacc', 'gai_restdevice', 'gait_walking_complete', 'participant_id'])
# Obs. = 2825
```

Out[ ]:

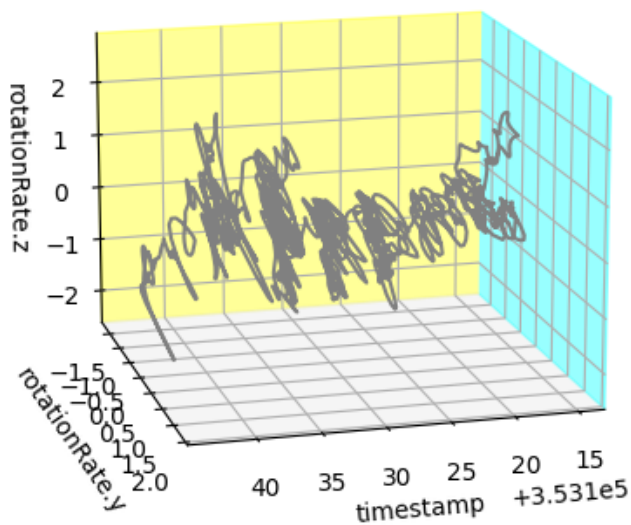
	timestamp	attitude.y	attitude.w	attitude.z	attitude.x	rotationRate.x	rotationRate.y	rotationRate.z	userAc
0	353114.990463	-0.088940	0.960291	1.387779e-17	0.264445	-0.049830	-0.027565	0.126862	
1	353115.000471	-0.089232	0.960348	5.710771e-04	0.264137	-0.053728	-0.023853	0.132588	
2	353115.010479	-0.089525	0.960414	1.133002e-03	0.263797	-0.063731	-0.029999	0.122687	
3	353115.020487	-0.089858	0.960479	1.604844e-03	0.263446	-0.063301	-0.046252	0.107445	
4	353115.030495	-0.090239	0.960534	2.007688e-03	0.263110	-0.052569	-0.059569	0.102781	

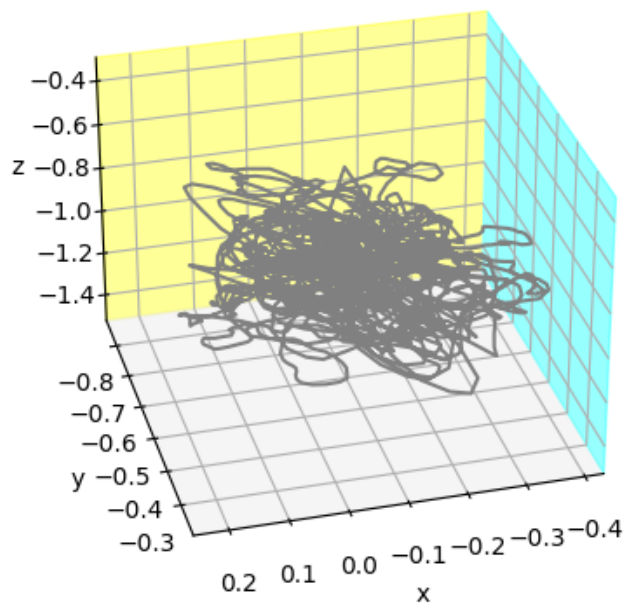
For the walking test I've begun to start looking at various features in the timeseries data through 3D graphs. I've also made a basic wrapper to do so...

In [ ]:

```
ThreeDPlot(df_outdevice, 'timestamp', 'rotationRate.y', 'rotationRate.z')
ThreeDPlot(df_outacc, 'x', 'y', 'z', view_angle_x=30)
```

c:\Users\benst\OneDrive\Desktop\CodingProjects\DegenCervicalMyelopathyLab\functions.py:124: UserWarning: No data for colormapping provided via 'c'. Parameters 'cmap' will be ignored  
 ax.scatter3D(data[x], data[y], data[z], c=c, cmap='Greens')

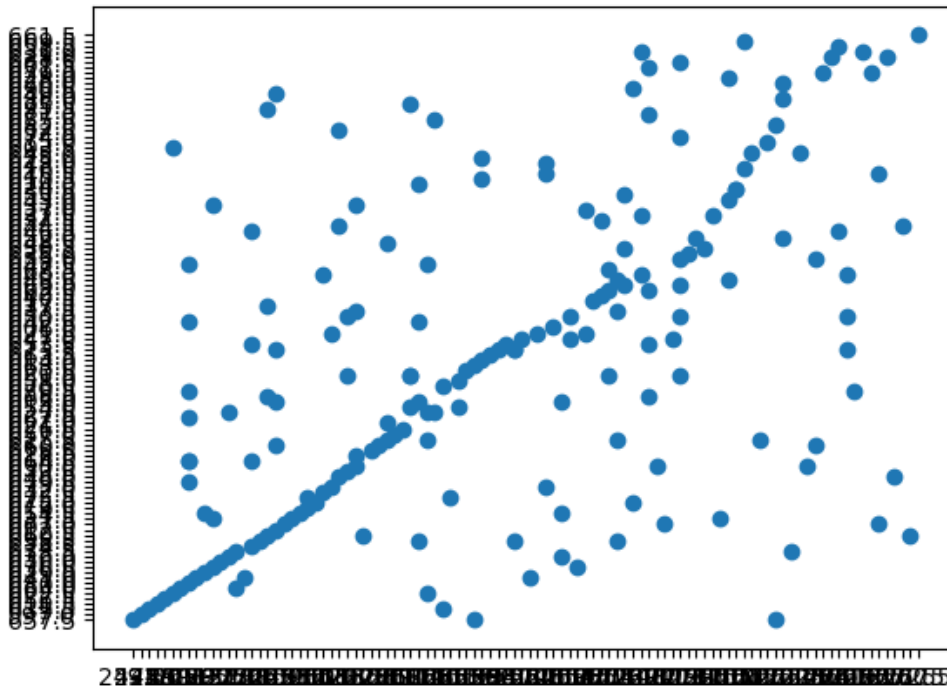




Here is some exploration for the tapping test... as you can see there seems to be some strange stuff happening here although I'd like to do the test myself to see if this kind of strange data is reproducible.

```
In [ ]: d = process_tap(cleanTest(oneTypeOfTestForParticipant(5,'tap',token)),token)
print(d.keys())
df_tap_leftjson_samples = dictListToDF(d['tap_leftjson.samples'])
df_tap_leftaccelerometer = dictListToDF(d['tap_leftaccelerometer'])
print(df_tap_leftaccelerometer.columns)
plt.scatter(df_tap_leftjson_samples['locationX'],df_tap_leftjson_samples['locationY'])
plt.show()
ThreeDPlot(df_tap_leftaccelerometer, 'x', 'y', 'z', c='timestamp', view_angle_y=30)

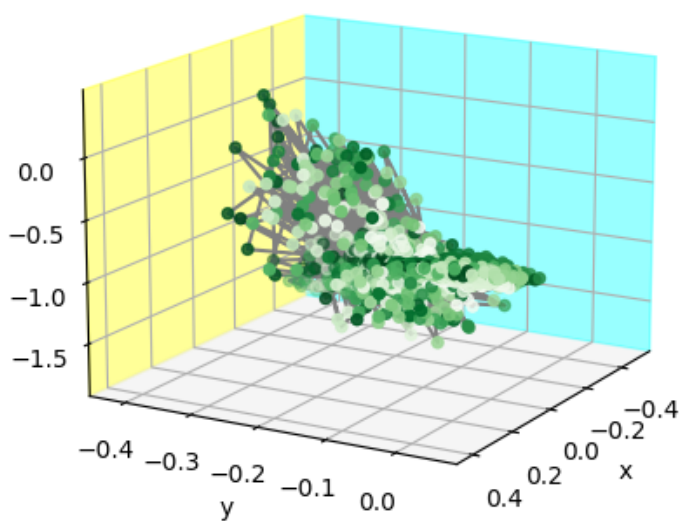
dict_keys(['tap_uuid', 'tap_startdate', 'tap_enddate', 'tap_scheduledate', 'tap_status', 'tap_supplementaldata', 'tap_serializedresult', 'tap_leftaccelerometer', 'tap_rightaccelerometer', 'tapping_complete', 'participant_id', 'tap_leftjson.samples', 'tap_leftjson.stepViewSize', 'tap_leftjson.buttonRect1', 'tap_leftjson.buttonRect2', 'tap_rightjson.samples', 'tap_rightjson.stepViewSize', 'tap_rightjson.buttonRect1', 'tap_rightjson.buttonRect2'])
Index(['y', 'timestamp', 'z', 'x'], dtype='object')
```



```

0      353756.127247
1      353756.137255
2      353756.147263
3      353756.157271
4      353756.167280
...
1998   353776.123521
1999   353776.133529
2000   353776.143537
2001   353776.153546
2002   353776.163554
Name: timestamp, Length: 2003, dtype: float64

```



The peg test is much simpler in terms of the data. No pulling of zipped files.

```
In [ ]: d=cleanTest(oneTypeOfTestForParticipant(5,'peg',token))
```

```
In [ ]: print(d.keys())
        d['peg_nondom_place']
```

```
dict_keys(['peg_uuid', 'peg_startdate', 'peg_enddate', 'peg_scheduledate', 'peg_status', 'peg_supplementaldata', 'peg_serializedresult', 'peg_dom_place', 'peg_dom_remove', 'peg_nondom_place', 'peg_nondom_remove', 'peg_test_complete', 'participant_id'])
```

```
Out[ ]: '{"dominantHandTested":"false","movingDirection":"Right","totalDistance":"2323.0948944091797","samples":[{"time":"3.7110564166796394","distance":"241.86631774902344"}, {"time":"2.275128624984063","distance":"251.11203002929688"}, {"time":"1.824287874973379","distance":"241.75323486328125"}, {"time":"2.4766482916893438","distance":"264.37060546875"}, {"time":"2.482281458331272","distance":"269.09210205078125"}, {"time":"5.399795499979518","distance":"214.89895629882812"}, {"time":"2.399718041648157","distance":"278.7796936035156"}, {"time":"2.9429723333450966","distance":"283.7906494140625"}, {"time":"2.6818896666518413","distance":"277.4313049316406"}],"rotated":"false","numberOfPegs":"9","totalSuccesses":"9","threshold":"0.2","totalTime":"26.205035124999995","totalFailures":"3"}'
```

... Although its not as simple as the timed walk a.k.a. my favorite test. Here it looks like there are just three variables, although currently this data shows that the test may be incomplete so would need to redo to be certain.

```
In [ ]: d=cleanTest(oneTypeOfTestForParticipant(5,'tim',token))
        d.keys()
```

```
Out[ ]: dict_keys(['tim_uuid', 'tim_startdate', 'tim_enddate', 'tim_scheduledate', 'tim_status', 'tim_supplementaldata', 'tim_serializedresult', 'tim_trial1', 'tim_turnaround', 'tim_trial2', 'timed_walk_complete', 'participant_id'])
```

```
In [ ]: d
```

```
Out[ ]: {'tim_uuid': 'A3B1C02A-446A-47C4-9F5B-D35D195BDBE0',
        'tim_startdate': '2023-01-15 08:34:10',
        'tim_enddate': '2023-01-15 08:34:56',
        'tim_scheduledate': '',
        'tim_status': '1',
        'tim_supplementaldata': '{"deviceuuid": "AA59EA11-CF26-450E-80E8-853A62FC9221",\n "devicemodel": "iPhone",\n "percentComplete": "100",\n "deviceversion": "16.0.2",\n "syncdate": "2023-01-15 08:34:56",\n "configversion": "4",\n "deviceplatform": "iOS",\n "appversion": "2.20.0",\n "devicemanufacturer": "Apple"}',
        'tim_serializedresult': 'result.zip',
        'tim_trial1': '14.202383166',
        'tim_turnaround': '3.046138666',
        'tim_trial2': '8.246413415999999',
        'timed_walk_complete': '0',
        'participant_id': '5'}
```