

matching_plot_constelation

April 27, 2017

```
In [1]: load_ext autoreload
```

```
In [2]: autoreload 2
```

```
In [24]: import numpy as np
import pyphi
import random
import makegridslibrary as me
import matplotlib
import matplotlib.pyplot as plt
import itertools
from pypci import pci
import pickle
from tsne import tsne
import bitarray as bit
from IPython.core.display import display, HTML

def i_to_bitlist(o):
    if not o:
        return [0]
    shifts = list( range( int( np.ceil(np.log2(o)) + 1 ) ) )
    shifts.reverse() # little endian
    return [(o >> shift) & 1 for shift in shifts]
```

```
In [4]: # Load results from matching_LB.py
```

```
temp = 0
# temp = .2
```

```
# Old measure
```

```
# results_filename = '/data/nsdm/pyphi/fivenodes_barVsshuffled_gridVSrandom_r
results_filename = '/data/nsdm/pyphi/fivenodes_barVsshuffled_gridVSrandom_r
```

```
print('EMD results')
```

```
with open(results_filename, 'rb') as f:
    results = pickle.load(f)
```

```

big_results_bar = results[2]
big_results_shuffled = results[3]

# for network in big_results_bar:

network = 'Grid'

print(network)
print('\tT : ', temp)
print('\tfor the bar')
for input_stim in big_results_bar[network][temp]:
    print('\t', input_stim)
    this_result = big_results_bar[network][temp][input_stim]
    bar_emd_big_phi = this_result[0]
    bar_emd_concepts = this_result[1]

print('\tfor the shuffled')
for input_stim in big_results_shuffled[network][temp]:
    print('\t', input_stim)
    this_result = big_results_shuffled[network][temp][input_stim]
    shu_emd_big_phi = this_result[0]
    shu_emd_concepts = this_result[1]
print('done.')

# New measure

# results_filename = '/data/nsdm/pyphi/fivenodes_barVsshuffled_gridVSrandom'
# results_filename = '/data/nsdm/pyphi/fivenodes_barVsshuffled_gridVSrandom'
# results_filename = '/data/nsdm/pyphi/fivenodes_barVsshuffled_gridVSrandom'
results_filename = '/data/nsdm/pyphi/fivenodes_barVsshuffled_gridVSrandom_E'

print('\nNew cut + entropy distance results')

with open(results_filename, 'rb') as f:
    results = pickle.load(f)

big_results_bar_new = results[2]
big_results_shuffled_new = results[3]

# for network in big_results_bar_new:

print(network)
print('\tT : ', temp)
print('\tfor the bar')
for input_stim in big_results_bar_new[network][temp]:
    print('\t', input_stim)
    this_result = big_results_bar_new[network][temp][input_stim]

```

```

        bar_new_big_phi = this_result[0]
        bar_new_concepts = this_result[1]

    print('\tfor the shuffled')
    for input_stim in big_results_shuffled_new[network][temp]:
        print('\t', input_stim)
        this_result = big_results_shuffled_new[network][temp][input_stim]
        shu_new_big_phi = this_result[0]
        shu_new_concepts = this_result[1]
    print('done.')
```

EMD results

Grid

```

T : 0
for the bar
    (0, 0, 0, 1, 1)
for the shuffled
    (0, 0, 1, 0, 1)
```

done.

New cut + entropy distance results

Grid

```

T : 0
for the bar
    (0, 0, 0, 1, 1)
for the shuffled
    (0, 0, 1, 0, 1)
```

done.

In [196]: # preprocess: build masks, labels, etc

```

def copy_and_mask(X):
    Y = X.copy()
    Y_invalid = Y == -1
    Y[Y_invalid] = 0
    Y_big_invalid = np.any(Y_invalid, axis=0)
    return(Y, Y_invalid, Y_big_invalid)

# Use EMD
[bar_concepts, bar_big_phi, shu_concepts, shu_big_phi] = [bar_emd_concept

# Use new cuts and distances
# [bar_concepts, bar_big_phi, shu_concepts, shu_big_phi] = [bar_new_conce

(bar, bar_invalid, bar_big_phi_invalid) = copy_and_mask(bar_concepts)
(shu, shu_invalid, shu_big_phi_invalid) = copy_and_mask(shu_concepts)
```

```

N = int(np.ceil(np.log2(bar.shape[0])))

# Generate mechanisms labels
mechanisms_orders = np.array([sum(i_to_bitlist(m)) for m in range(2**N)])
# null mechanism is impossible
# mechanisms_orders = mechanisms_orders[1:]
# created a sorted index
mo_sorted_idx = np.argsort(mechanisms_orders)
sorted_mechanisms_orders = mechanisms_orders[mo_sorted_idx]

# Generate states labels
gs = np.array(list(itertools.product((0, 1), repeat=N)))
# print(grid_states)
# print(np.abs(np.diff(grid_states, axis=1)))
def neighbor(i, N, d):
    j = i + d
    # cycle right
    while j > N-1:
        j = j-N
    # cycle left
    while j < 0:
        j = j+N
    return j

def state_label_cont(s):
    if not np.sum(s) or np.sum(s) == len(s):
        label = 'full'
    else:
        second_order = [s[i] + s[neighbor(i, N, 1)] for i in range(N)]
        n1 = np.sum(1*[s2 == 1 for s2 in second_order])
        n2 = np.sum(1*[s2 == 2 for s2 in second_order])
        # print(n2, s)
        if n2 == 0:
            label = 'shuffled'
        elif n2 == 1:
            # if n1 > 0
            label = 'mixed'
        elif n2 == 2:
            label = 'bigbar2'
        elif n2 == 3:
            label = 'bigbar3'
        else:
            raise ValueError('Invalid state')
    return label

def state_label_acti(s):
    # s = [s[i] + s[neighbor(i, N, 1)] for i in range(N)]

```

```

#     s = [s[neighbor(i,N,-1)] + s[i] + s[neighbor(i,N,1)] for i in range
#     s = [1*(si > 1) for si in s]
#     s = [1*(si != 1) for si in s]

s = [1*(s[neighbor(i,N,-1)] == s[i]) + 1*(s[neighbor(i,N,1)] == s[i])

    return np.sum(s)

states_labels = [state_label_cont(s) for s in gs]
# states_labels = [state_label_acti(s) for s in gs]

sl_sorted_idx = np.argsort(states_labels)
sorted_states_labels = [states_labels[sl] for sl in sl_sorted_idx]

```

```

In [197]: s=gs[6]
ss = [1*(s[neighbor(i,N,-1)] == s[i]) + 1*(s[neighbor(i,N,1)] == s[i])
# print(s)
# print(ss)
print(np.sum(ss))

plt.figure(figsize=(10,10))

print(states_labels)
plt.plot(states_labels, list(range(2*N)))
plt.yticks(range(2*N), gs)
plt.show()

plt.figure(figsize=(10,4))
plt.hist(states_labels)
plt.show()

```

6

```
['full', 'shuffled', 'shuffled', 'mixed', 'shuffled', 'shuffled', 'mixed', 'bigbar2']
```

ValueError Traceback (most recent call last)

```

<ipython-input-197-db10d8ffea54> in <module>()
     9
    10 print(states_labels)
---> 11 plt.plot(states_labels, list(range(2*N)))
    12 plt.yticks(range(2*N), gs)

```

```

13 plt.show()

/home/leonardo/anaconda3/envs/nsdm-pyphi/lib/python3.4/site-packages/matplotlib
3316             mplDeprecation)
3317     try:
-> 3318         ret = ax.plot(*args, **kwargs)
3319     finally:
3320         ax._hold = washold

/home/leonardo/anaconda3/envs/nsdm-pyphi/lib/python3.4/site-packages/matplotlib
1890         warnings.warn(msg % (label_namer, func.__name__),
1891                        RuntimeWarning, stacklevel=2)
-> 1892         return func(ax, *args, **kwargs)
1893         pre_doc = inner.__doc__
1894         if pre_doc is None:

/home/leonardo/anaconda3/envs/nsdm-pyphi/lib/python3.4/site-packages/matplotlib
1405
1406         for line in self._get_lines(*args, **kwargs):
-> 1407             self.add_line(line)
1408             lines.append(line)
1409

/home/leonardo/anaconda3/envs/nsdm-pyphi/lib/python3.4/site-packages/matplotlib
1785         line.set_clip_path(self.patch)
1786
-> 1787         self._update_line_limits(line)
1788         if not line.get_label():
1789             line.set_label('_line%d' % len(self.lines))

/home/leonardo/anaconda3/envs/nsdm-pyphi/lib/python3.4/site-packages/matplotlib
1807         Figures out the data limit of the given line, updating self.data
1808         """
-> 1809         path = line.get_path()
1810         if path.vertices.size == 0:
1811             return

/home/leonardo/anaconda3/envs/nsdm-pyphi/lib/python3.4/site-packages/matplotlib
987         """
988         if self._invalidy or self._invalidx:
--> 989             self.recache()
990         return self._path

```

991

```
/home/leonardo/anaconda3/envs/nsdm-pyphi/lib/python3.4/site-packages/matplotlib/
674         x = ma.asarray(xconv, np.float_).filled(np.nan)
675     else:
--> 676         x = np.asarray(xconv, np.float_)
677         x = x.ravel()
678     else:

/home/leonardo/anaconda3/envs/nsdm-pyphi/lib/python3.4/site-packages/numpy/
529
530     """
--> 531     return array(a, dtype, copy=False, order=order)
532
533
```

ValueError: could not convert string to float: 'full'

```
In [198]: # [np.sum(sorted_mechanisms_orders==o) for o in np.unique(mechanisms_order
# print(sl_sorted_idx)
mechanisms_orders
# print(mechanisms_orders)
# print(sorted_mechanisms_orders)
#print(sorted_states_labels)
```

```
Out[198]: array([0, 1, 1, 2, 1, 2, 2, 3, 1, 2, 2, 3, 2, 3, 3, 4, 1, 2, 2, 3, 2, 3,
4, 2, 3, 3, 4, 3, 4, 4, 5])
```

```
In [200]: # Big Phi
```

```
plt.figure(figsize=(17,4))

plt.subplot(1,2,1)
plt.ylim([0, 1])
Y = bar_big_phi.copy()
Y[bar_big_phi_invalid] = 0
plt.bar(range(len(Y)), Y[sl_sorted_idx])
plt.xticks(range(len(Y)), sorted_states_labels, rotation=45)
plt.ylabel('Big Phi')

plt.subplot(1,2,2)
plt.ylim([0, 1])
# Y = bar_big_phi_new.copy()
# Y[bar_big_phi_new_invalid] = 0
```

```

Y = shu_big_phi.copy()
Y[shu_big_phi_invalid] = 0
plt.bar(range(len(Y)), Y[sl_sorted_idx])
plt.xticks(range(len(Y)), sorted_states_labels, rotation=45)

plt.ylabel('Big Phi')

plt.show()

# All concepts

def norm_min_max(Y):
    Z = (Y-min(Y.flatten()))/(max(Y.flatten())-min(Y.flatten()))
    return Z

plt.figure(figsize=(17,8))

plt.subplot(1,2,1)
# Y = X[sl_sorted_idx, :]

# Why numpy, why...
# Y = bar[mo_sorted_idx, sl_sorted_idx].copy()
bar_sorted = bar[mo_sorted_idx, :].copy()[:, sl_sorted_idx]

# bar_sorted[bar_invalid[mo_sorted_idx, :][:, sl_sorted_idx]] = 0
# bar_sorted = np.ma.masked_where(X_invalid[sl_sorted_idx, :], X[sl_sorted_idx, :])

# bar_sorted = norm_min_max(Y)

plt.imshow(bar_sorted, aspect='auto')
plt.yticks(range(len(mo_sorted_idx)), sorted_mechanisms_orders)
plt.xticks(range(len(sl_sorted_idx)), sorted_states_labels, rotation=45)
# plt.xticks(range(len(sl_sorted_idx)), range(len(sl_sorted_idx)), rotation=45)

plt.colorbar()

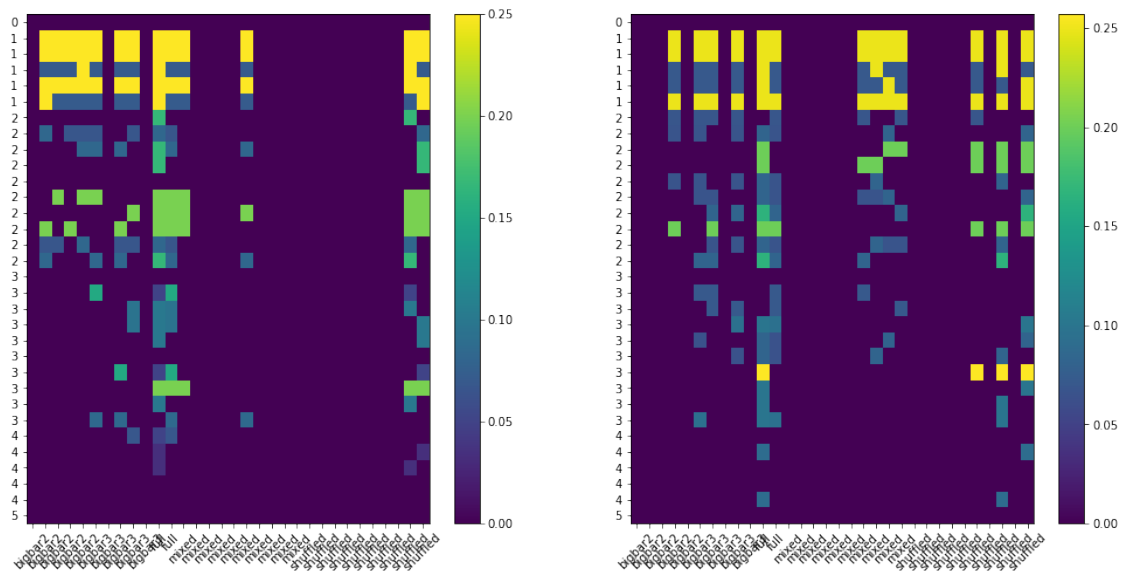
plt.subplot(1,2,2)
# Y = X_new[sl_sorted_idx, :]

# shu_sorted = shu[mo_sorted_idx, sl_sorted_idx].copy()
shu_sorted = shu[mo_sorted_idx, :].copy()[:, sl_sorted_idx]

# shu_sorted[shu_invalid[mo_sorted_idx, :][:, sl_sorted_idx]] = 0
# shu_sorted = np.ma.masked_where(X_new_invalid[sl_sorted_idx, :], X_new[sl_sorted_idx, :])

# shu_sorted = norm_min_max(Y_shu)

```

```
In [201]: # number_only = 1
          # number_only = 0

for number_only in range(2):

    display(HTML("<center><h1 style='font-size: %dpx;height: 100;*>%s</h1>"
                  ((40, '# of concepts') if number_only else (50, '&Sigma; &phi;

    # unique mechanisms
    unique_mechanism_orders = np.unique(sorted(sorted_mechanisms_orders))

    # unique and states
    unique_states_labels = np.unique(sorted(sorted_states_labels))
    nstates = len(unique_states_labels)

    # BAR

    # find all the concepts for the bar
    if number_only:
        bar_sorted_n = 1. * (bar_sorted > 0)
    else:
        bar_sorted_n = bar_sorted

    # sum all the mechanisms for a given order, per state
    bar_sorted_cpmo = np.array([np.sum(bar_sorted_n[sorted_mechanisms_oro
                                     for o in unique_mechanism_orders])

    # remove invalid states
```

```

invalid_bar_states = np.all(bar_invalid[mo_sorted_idx, :][:, sl_sorted_idx], axis=0)
sorted_bar_states_labels_noinv = np.delete(sorted_states_labels, np.where(invalid_bar_states))
bar_sorted_cpmo_noinv = np.delete(bar_sorted_cpmo, np.where(invalid_bar_states))

# take the mean and std accross valid states
bar_sorted_cpmosc = np.array([np.mean(bar_sorted_cpmo_noinv[:, [ss == s]], axis=0)
                              for s in unique_states_labels]).T
bar_sorted_cpmosc_std = np.array([np.std(bar_sorted_cpmo_noinv[:, [ss == s]], axis=0)
                                   for s in unique_states_labels]).T

# SHUFFLED

# find all the concepts for the shuffled
if number_only:
    shu_sorted_n = 1. * (shu_sorted > 0)
else:
    shu_sorted_n = shu_sorted

# sum all the mechanisms for a given order, per state
shu_sorted_cpmo = np.array([np.sum(shu_sorted_n[sorted_mechanisms_order == o], axis=0)
                             for o in np.unique(sorted_mechanisms_order)])

# remove invalid states
invalid_shu_states = np.all(shu_invalid[mo_sorted_idx, :][:, sl_sorted_idx], axis=0)
sorted_shu_states_labels_noinv = np.delete(sorted_states_labels, np.where(invalid_shu_states))
shu_sorted_cpmo_noinv = np.delete(shu_sorted_cpmo, np.where(invalid_shu_states))

# take the mean and std accross valid states
shu_sorted_cpmosc = np.array([np.mean(shu_sorted_cpmo_noinv[:, [ss == s]], axis=0)
                              for s in unique_states_labels]).T
shu_sorted_cpmosc_std = np.array([np.std(shu_sorted_cpmo_noinv[:, [ss == s]], axis=0)
                                   for s in unique_states_labels]).T

plt.figure(figsize=(17,4))

plt.subplot(1,2,1)
plt.imshow(bar_sorted_cpmosc, aspect='auto')
plt.xticks(range(len(unique_states_labels)), unique_states_labels, rotation=45)
plt.colorbar()
plt.title('Bar')

plt.subplot(1,2,2)
plt.imshow(shu_sorted_cpmosc, aspect='auto')
plt.xticks(range(len(unique_states_labels)), unique_states_labels, rotation=45)
plt.colorbar()
plt.title('Shuffled')

plt.show()

```

```

plt.figure(figsize=(17,4))
the_diff = shu_sorted_cpmsoc-bar_sorted_cpmsoc
the_diff_max = max(abs(the_diff.flatten()))
plt.imshow(the_diff, aspect='auto', cmap='bwr', vmin=-the_diff_max, v
plt.colorbar()
plt.xticks(range(len(unique_states_labels)), unique_states_labels, ro
plt.title('Shuffled - Bar')
plt.show()

```

```

for o in range(1, len(unique_mechanism_orders)):

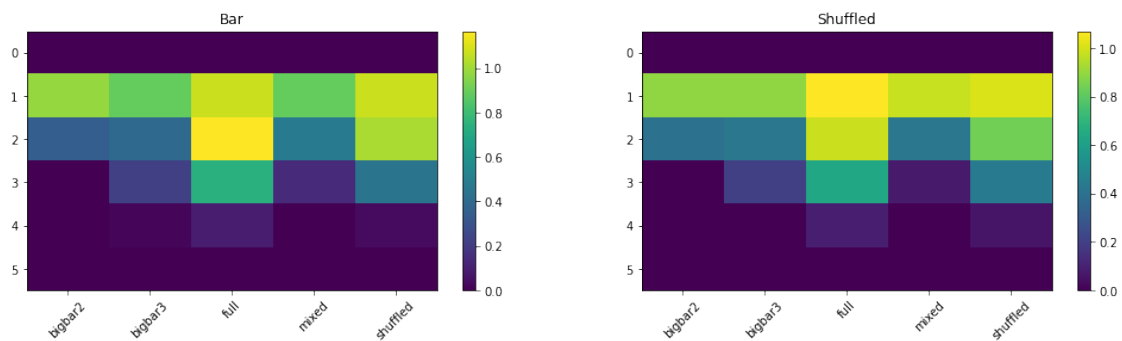
    plt.figure(figsize=(10,3))

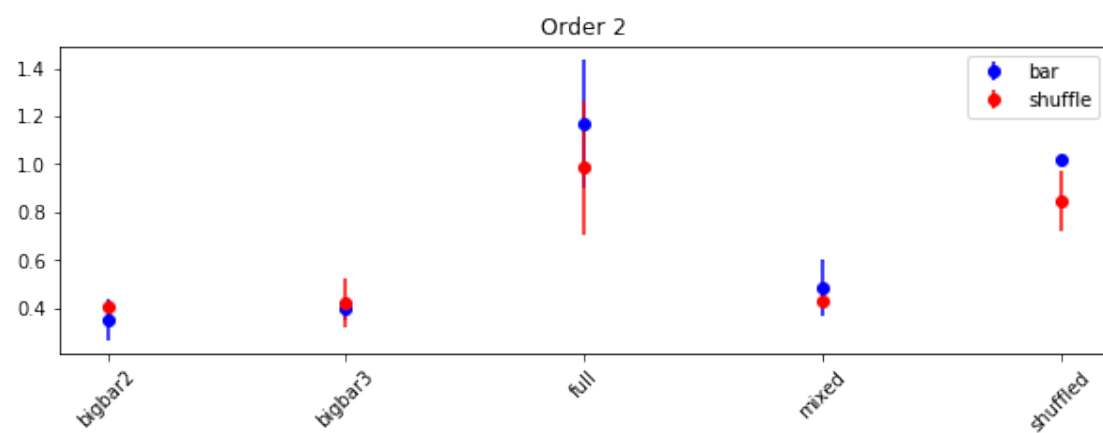
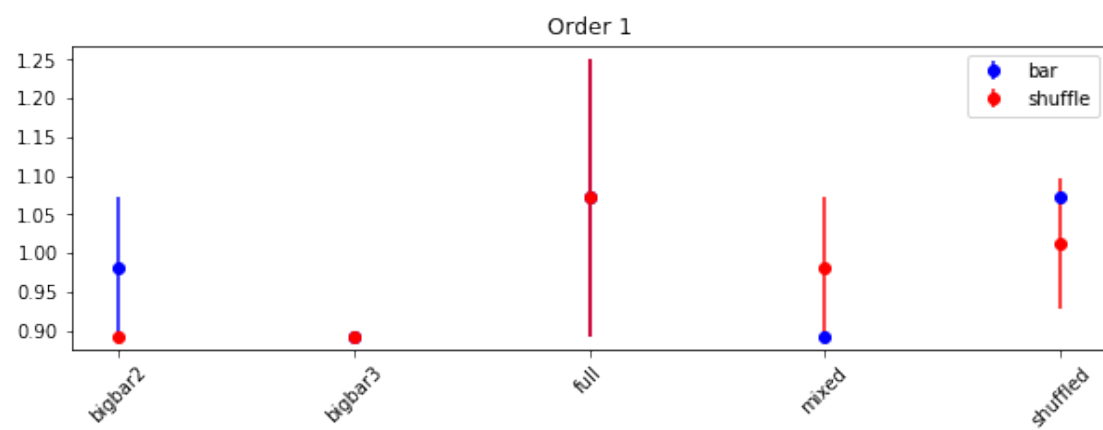
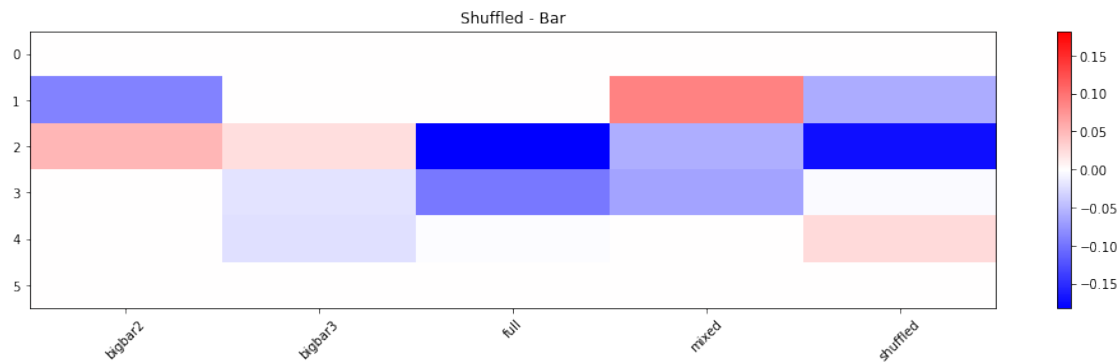
    hb = plt.errorbar(range(nstates), bar_sorted_cpmsoc[o, :], yerr=b
    hs = plt.errorbar(range(nstates), shu_sorted_cpmsoc[o, :], yerr=s
    plt.legend([hb, hs], ['bar', 'shuffle'])
    plt.xticks(range(len(unique_states_labels)), unique_states_labels
    plt.title('Order %d' % o)

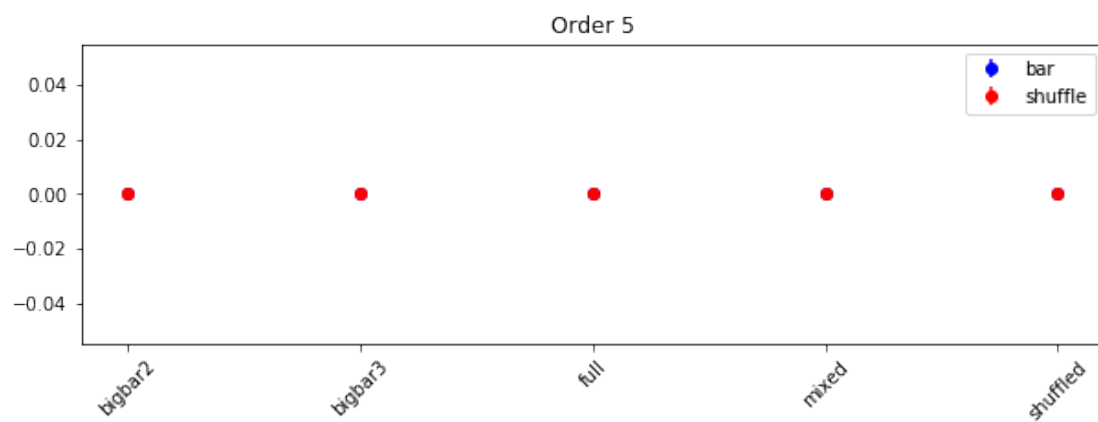
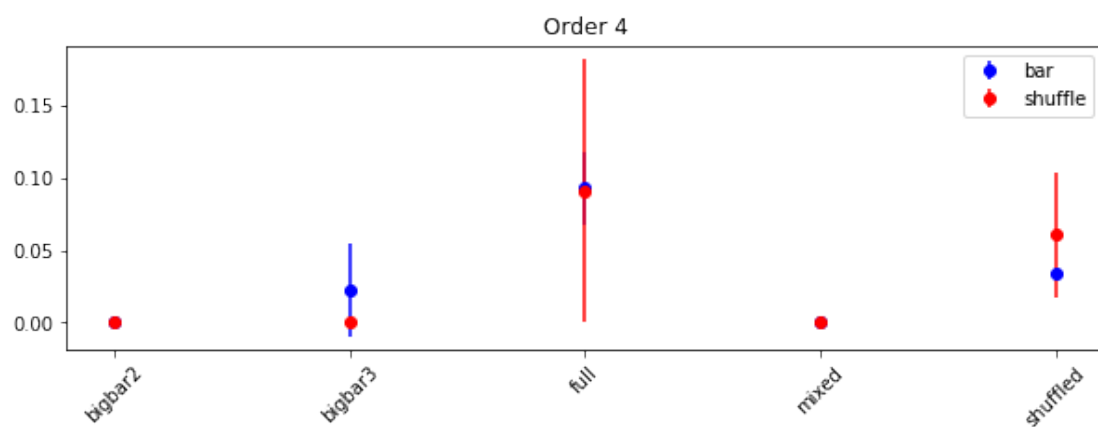
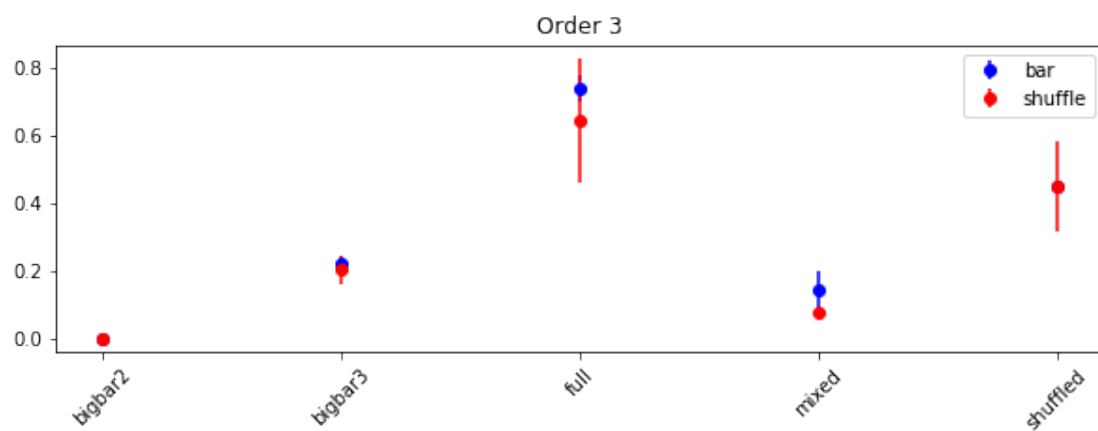
    plt.show()

```

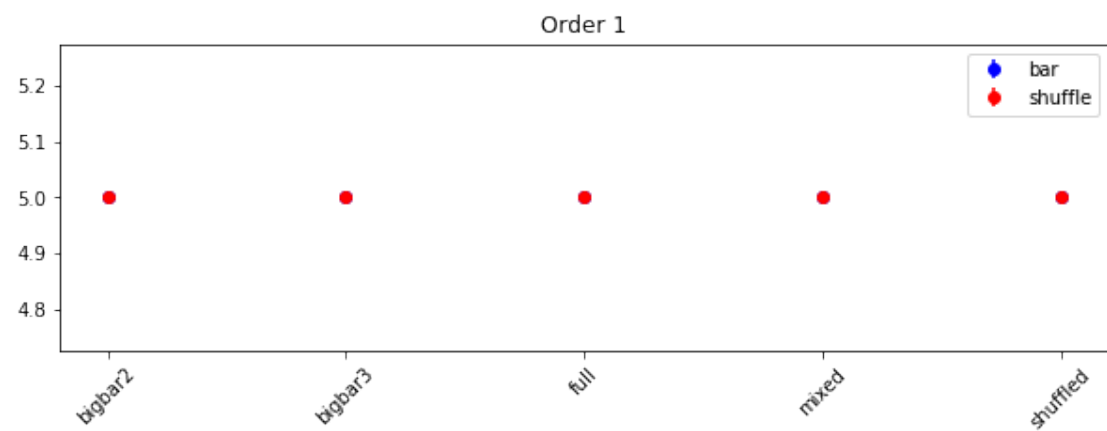
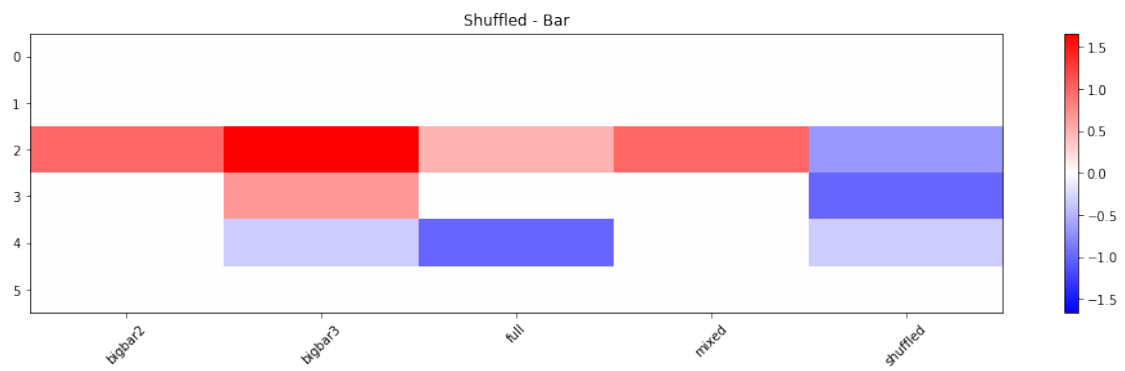
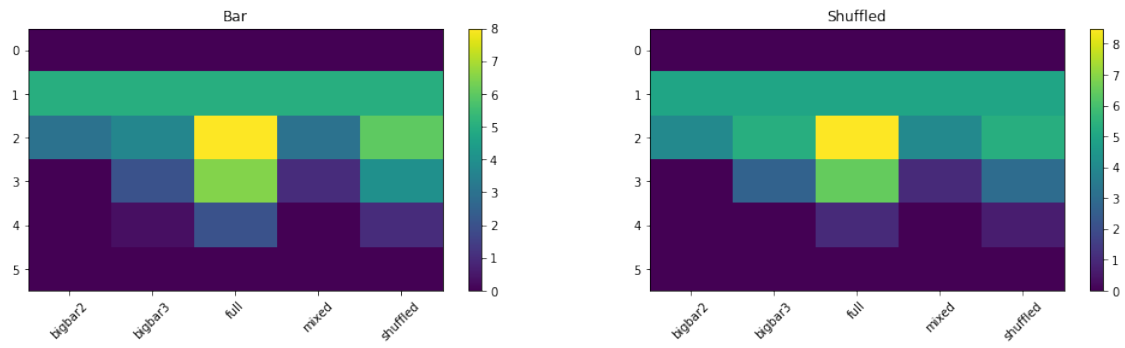
<IPython.core.display.HTML object>

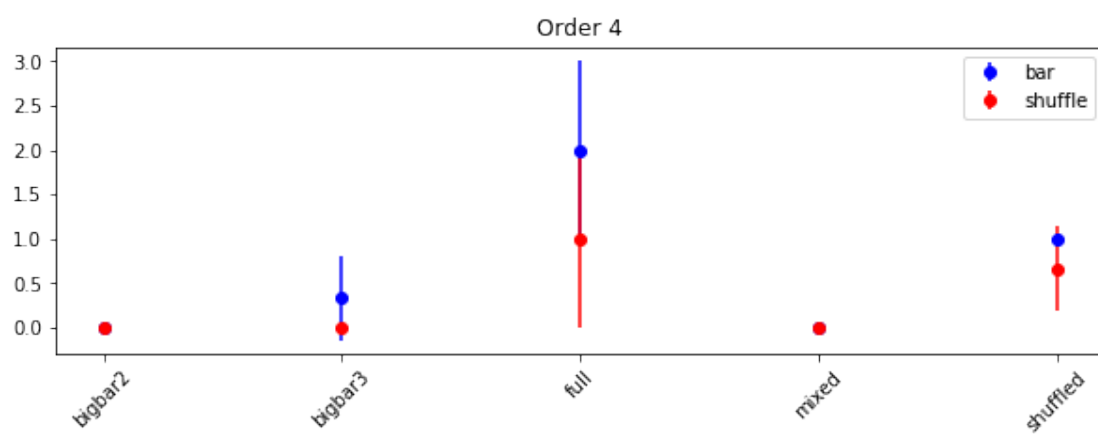
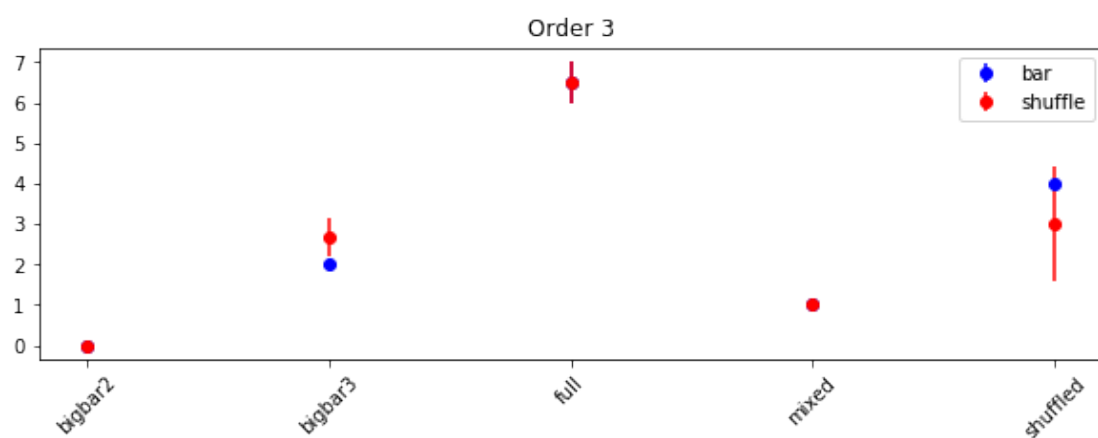
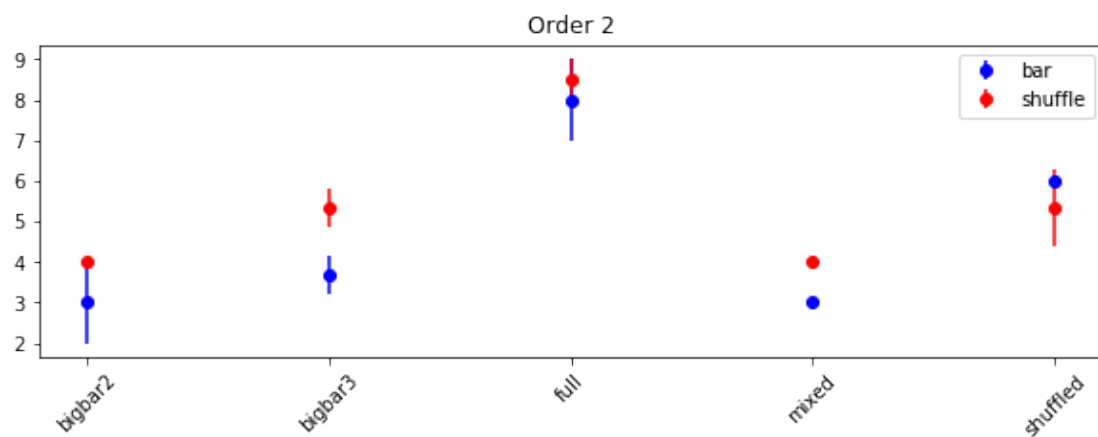


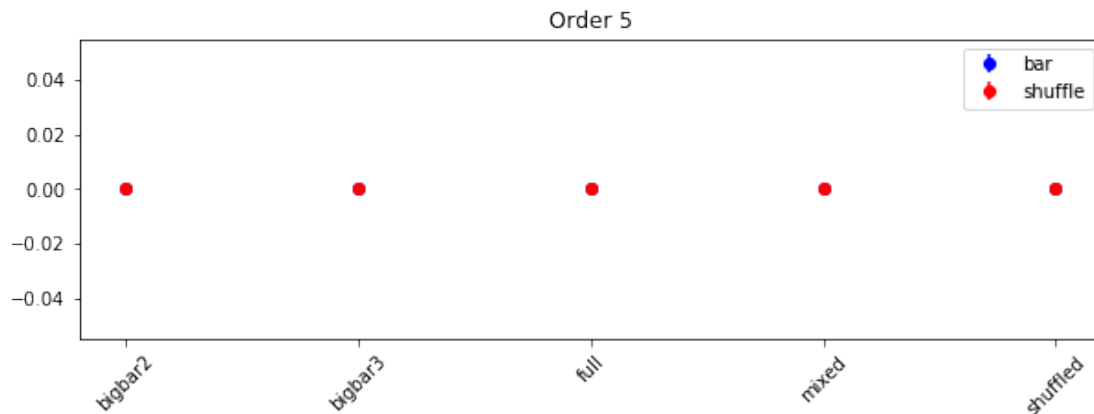




<IPython.core.display.HTML object>







```
In [208]: # State labels
```

```
X = bar.T.copy()
```

```
# continuity
```

```
# labels = states_labels.copy()
```

```
# unique_labels_values = np.unique(labels)
```

```
# unique_labels = unique_labels_values
```

```
# bar vs shuffled
```

```
# labels = states_labels.copy()
```

```
# labels_to_int = {'full': 1, 'shuffled': 2, 'mixed': 3, 'bigbar2': 4, 'bigbar3': 5}
```

```
# labels = np.array([labels_to_int[s] for s in labels])
```

```
# unique_labels_values = list(labels_to_int.values())
```

```
# unique_labels = labels_to_int.keys()
```

```
# Mechanism labels
```

```
X = bar.copy()
```

```
labels = mechanisms_orders.copy()
```

```
unique_labels_values = np.unique(labels)
```

```
unique_labels = unique_labels_values
```

```
# X = np.loadtxt("./tsne/mnist2500_X.txt");
```

```
# labels = np.loadtxt("./tsne/mnist2500_labels.txt");
```

```
Y = tsne.tsne(X, 2, 50, 20.0)
```

```
Preprocessing the data using PCA...
```

```
Computing pairwise distances...
```

```
Computing P-values for point 0 of 32 ...
```

```
Mean value of sigma: 0.232840008782
```

Iteration	10	: error is	10.8421054037
Iteration	20	: error is	10.5130750976
Iteration	30	: error is	10.1467157004
Iteration	40	: error is	10.4974449252
Iteration	50	: error is	9.60596882615
Iteration	60	: error is	9.56683722161
Iteration	70	: error is	10.6079576952
Iteration	80	: error is	10.3190645416
Iteration	90	: error is	10.4364399743
Iteration	100	: error is	9.42144935303
Iteration	110	: error is	0.981397460112
Iteration	120	: error is	0.869544627301
Iteration	130	: error is	0.797414343533
Iteration	140	: error is	0.742332215212
Iteration	150	: error is	0.652262402185
Iteration	160	: error is	0.563451187057
Iteration	170	: error is	0.533495533184
Iteration	180	: error is	0.516064522462
Iteration	190	: error is	0.507405689709
Iteration	200	: error is	0.500660731866
Iteration	210	: error is	0.488217069869
Iteration	220	: error is	0.478906036814
Iteration	230	: error is	0.468670871253
Iteration	240	: error is	0.464441261938
Iteration	250	: error is	0.461782534312
Iteration	260	: error is	0.457934031193
Iteration	270	: error is	0.452314351276
Iteration	280	: error is	0.448374677711
Iteration	290	: error is	0.444617747016
Iteration	300	: error is	0.441538968758
Iteration	310	: error is	0.437780923505
Iteration	320	: error is	0.432649981967
Iteration	330	: error is	0.425376737527
Iteration	340	: error is	0.414465379722
Iteration	350	: error is	0.39847412371
Iteration	360	: error is	0.372593376458
Iteration	370	: error is	0.345702571443
Iteration	380	: error is	0.325076743765
Iteration	390	: error is	0.314441612079
Iteration	400	: error is	0.312203191338
Iteration	410	: error is	0.311068172773
Iteration	420	: error is	0.310298741795
Iteration	430	: error is	0.309307825529
Iteration	440	: error is	0.307057359275
Iteration	450	: error is	0.299212767555
Iteration	460	: error is	0.296661877733
Iteration	470	: error is	0.295686901023
Iteration	480	: error is	0.295246680407

Iteration 490 : error is 0.294818536377
Iteration 500 : error is 0.294183050505
Iteration 510 : error is 0.29244740447
Iteration 520 : error is 0.290123105781
Iteration 530 : error is 0.289501746518
Iteration 540 : error is 0.289309833641
Iteration 550 : error is 0.289232088086
Iteration 560 : error is 0.289196393759
Iteration 570 : error is 0.289172760524
Iteration 580 : error is 0.289156120085
Iteration 590 : error is 0.289145558047
Iteration 600 : error is 0.289139461979
Iteration 610 : error is 0.289136053566
Iteration 620 : error is 0.289133758356
Iteration 630 : error is 0.289131829592
Iteration 640 : error is 0.289129966819
Iteration 650 : error is 0.289127996891
Iteration 660 : error is 0.289125816518
Iteration 670 : error is 0.289123370645
Iteration 680 : error is 0.289120634697
Iteration 690 : error is 0.289117594623
Iteration 700 : error is 0.289114238678
Iteration 710 : error is 0.289110553792
Iteration 720 : error is 0.28910652488
Iteration 730 : error is 0.289102135268
Iteration 740 : error is 0.289097373856
Iteration 750 : error is 0.289092309817
Iteration 760 : error is 0.28908688164
Iteration 770 : error is 0.289081014301
Iteration 780 : error is 0.28907467243
Iteration 790 : error is 0.289067824626
Iteration 800 : error is 0.289060479403
Iteration 810 : error is 0.289052782585
Iteration 820 : error is 0.289044693006
Iteration 830 : error is 0.28903599914
Iteration 840 : error is 0.289026624569
Iteration 850 : error is 0.289016910744
Iteration 860 : error is 0.289006613117
Iteration 870 : error is 0.288995708
Iteration 880 : error is 0.288984641153
Iteration 890 : error is 0.288972997685
Iteration 900 : error is 0.288960697502
Iteration 910 : error is 0.288947358275
Iteration 920 : error is 0.28893327515
Iteration 930 : error is 0.288918917261
Iteration 940 : error is 0.288904440792
Iteration 950 : error is 0.288889343742
Iteration 960 : error is 0.28887319453

```
Iteration 970 : error is 0.288855923795
Iteration 980 : error is 0.288838101773
Iteration 990 : error is 0.288819937401
Iteration 1000 : error is 0.288800558712
```

```
In [209]: plt.figure()
```

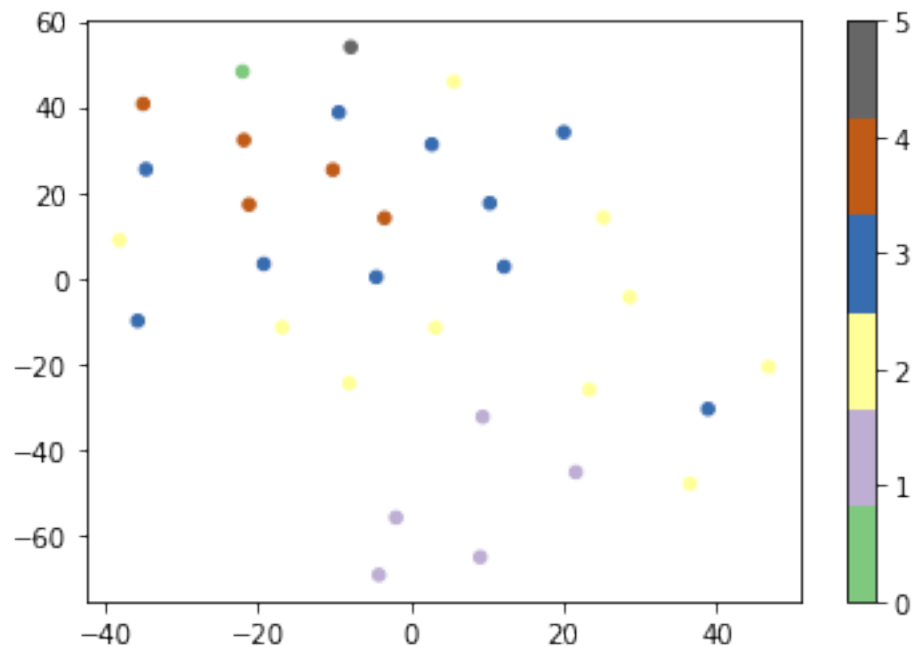
```
cmap = plt.get_cmap('Accent', len(unique_labels))
```

```
plt.scatter(Y[:,0], Y[:,1], 20, c=labels, label=labels, cmap=cmap,
            vmin=min(unique_labels_values), vmax=max(unique_labels_values))
```

```
cbar = plt.colorbar(ticks=unique_labels_values)
```

```
cbar.ax.set_yticklabels(unique_labels) # horizontal colorbar
```

```
plt.show()
```



```
In [116]: unique_labels_values
```

```
Out[116]: [1, 2, 3, 5, 4]
```

```
In [106]: for key, value in labels_to_int.items():
           print(key, value)
```

```
bigbar3 5
shuffled 2
```

bigbar2 4
mixed 3
full 1