Implement a new Measure The BRAPH 2 Developers May 31, 2023

This is the developer tutorial for implementing a new measure. In this Tutorial, we will explain how to create the generator file *.gen.m for a new measure which can the be compiled by braph2genesis, using the measures Degree, DegreeAv, Distance, and Triangles as examples.

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Implementation of Degree

We will start by implementing in detail the measure Degree, which applies to most graphs and is a direct extension of the element Measure.

Code 1: Degree element header. The header section of generator code for _Degree.gen.m provides the general information about the Degree element.

```
1 %% iheader!
_{	exttt{2}} Degree < Measure (m, degree) is the graph degree. (	exttt{1})
 %% idescription!
 The degree of a node is the number of edges connected to the node within a
       layer.
6 Connection weights are ignored in calculations.
```

Code 2: Degree element prop update. The props_update section of generator code for _Degree.gen.m updates the properties of the Measure element. This defines the core properties of the measure.

```
%% iprops_update!
3 %% iprop!
4 NAME (constant, string) is the name of the degree.
5 %%% idefault!
6 'Degree'
8 %% iprop!
9 DESCRIPTION (constant, string) is the description of the degree.
10 %%% idefault!
_{	ext{11}} 'The degree of a node is the number of edges connected to the node within a
       layer. Connection weights are ignored in calculations.'
13 %% iprop!
14 TEMPLATE (parameter, item) is the template of the degree.
16 %% iprop!
17 ID (data, string) is a few-letter code of the degree.
18 %%% idefault!
19 'Degree ID'
21 %% iprop!
LABEL (metadata, string) is an extended label of the degree.
23 %%% idefault!
24 'Degree label'
26 %% iprop!
27 NOTES (metadata, string) are some specific notes about the degree.
28 %%% idefault!
29 'Degree notes'
31 %% iprop! (1)
32 SHAPE (constant, scalar) is the measure shape __Measure.NODAL__.
33 %%% idefault!
34 Measure.NODAL
```

¹⁾ The element Degree is defined as a subclass of Measure. The moniker will be m.

⁽¹⁾ Measures have a *shape*: Measure.GLOBAL (a value for the whole brain graph, e.g., average degree), Measure.NODAL (a value for each brain region, e.g., degree, or Measure.BINODAL (a value for each couple of brain regions, e.g., distance between couples of nodes).

```
36 %% iprop! (2)
37 SCOPE (constant, scalar) is the measure scope __Measure.UNILAYER__.
  %%% idefault!
  Measure.UNILAYER
41 %% iprop! (3)
42 PARAMETRICITY (constant, scalar) is the parametricity of the measure
       __Measure.NONPARAMETRIC__.
  %%% idefault!
44 Measure.NONPARAMETRIC
  %% iprop! (4)
  COMPATIBLE_GRAPHS (constant, classlist) is the list of compatible graphs.
48 %%% idefault!
  {'GraphWU' 'GraphBU' 'MultigraphBUD' 'MultigraphBUT' 'MultiplexWU' '
       MultiplexBU' 'MultiplexBUD' 'MultiplexBUT' 'OrdMxWU' 'OrdMxBU'}
51 %% iprop! (5)
52 M (result, cell) is the degree.
  %%% icalculate!
  g = m.get('G'); (6)
  A = g.get('A'); (7)
  degree = cell(g.get('LAYERNUMBER'), 1); (8)
57
  parfor li = 1:1:g.get('LAYERNUMBER')
      Aii = A\{li, li\};
      Aii = binarize(Aii); (9)
      degree(li) = {sum(Aii, 2)}; (10)
63
  value = degree; (11)
```

Code 3: **Degree element tests.** The tests section from the element generator _Degree.gen.m. A test should be prepared for each graph with which the measure is compatible. The test should at least verify in some simple cases that the value of the measure is correct.

```
%% itests!
  %% iexcluded_props! (1)
  [Degree.PFM]
6 %% itest! (2)
7 %%% iname!
8 GraphWU
9 %%% iprobability! (3)
10 .01
  %%% icode!
12 B = [
          .6 1
      .6 0
              0
14
      1
          0
              0
15
      ];
18 known_degree = {[2 1 1]'}; (4)
```

- (2) Measures have a scope: Measure.SUPERGLOBAL (a result for the whole multi-layer graph, e.g., overlapping strength), Measure.UNILAYER (a result for each layer, e.g., average strength), or Measure.BILAYER (a result for each couple of layers).
- (3) Measures are either Measure.NONPARAMETRIC (the usual case) or Measure. PARAMETRIC (depending on some parameter).
- (4) Each measure has a list of compatible graphs for which the measure can be used.
- (5) The property M contains the code to be executed to calculate the measure. Here is where most of the action happens.
- (6) retrieves the graph from the property G of the measure m.
- 7 retrieves the cell with the adjacency matrix (for graph) or 2D-cell array (for multigraph, multiplex, etc.).
- (8) preallocates the variable to contain the result of the measure calculation.
- 9 binarizes the adjacency matrix (removing diagonal).
- (10) calculates the degree of the node for layer li.
- (11) returns the calcualted value of the measure degree assigning it to the output variable value.
- (1) List of properties that are excluded from testing.
- (2) Test for GraphWU. Similar tests should be implemented for each graph compatible with the measure.
- (3) assings a low test execution probability.
- (4) is the expected value of the measure calculated by external means.

```
g = GraphWU('B', B); (5)
m_outside_g = Degree('G', g); 6
23 assert(isequal(m_outside_g.get('M'), known_degree), ... (7)
      [BRAPH2.STR ':Degree:' BRAPH2.FAIL_TEST], ...
      [class(m_outside_g) ' is not being calculated correctly for ' class(g) '
       . '])
m_inside_g = g.get('MEASURE', 'Degree'); 8
assert(isequal(m_inside_g.get('M'), known_degree), ... (8)
      [BRAPH2.STR ':Degree: BRAPH2.FAIL_TEST], ...
      [{\tt class(m\_inside\_g)} \ {\tt 'is\ not\ being\ calculated\ correctly\ for\ '\ class(g)\ '.
31
```

- (5) creates the graph.
- (6) creates the measure.
- $\overline{7}$ tests that the value of the measure coicides with its expected value.
- (8) extracts the measure from the graph.
- (8) tests that the value of the measure extracted from the graph coicides with its expected value.

Implementation of DegreeAv

We can now use Degree as the basis to implement the global measure DegreeAv. The parts of the code that are modified are highlighted.

Code 4: **DegreeAv element header.** The header section of generator code for _DegreeAv.gen.m provides the general information about the DegreeAv element. ← Code 1

```
<sup>2</sup> DegreeAv < Degree (m, average degree) is the graph average degree. (1)
4 %% idescription!
5 The average degree of a graph is the average of all number of edges
       connected to a node within a layer.
6 Connection weights are ignored in calculations.
```

Code 5: **DegreeAv element prop update.** The props_update section of generator code for _DegreeAv.gen.m updates the properties of the Degree element. ← Code 2

```
1 %% iprops_update!
4 NAME (constant, string) is the name of the average degree.
5 %%% idefault!
6 'DegreeAv'
8 %% iprop!
9 DESCRIPTION (constant, string) is the description of the average degree
10 %%% idefault!
'The average degree of a graph is the average of all number of edges
      connected to a node within a layer. Connection weights are ignored in
       calculations.'
13 %% iprop!
14 TEMPLATE (parameter, item) is the template of the average degree
16 %% iprop!
17 ID (data, string) is a few-letter code of the average degree.
18 %%% idefault!
19 'DegreeAv ID'
21 %% iprop!
22 LABEL (metadata, string) is an extended label of the average degree
23 %%% idefault!
24 'DegreeAv label'
26 %% iprop!
27 NOTES (metadata, string) are some specific notes about the average degree
28 %%% idefault!
29 'DegreeAv notes'
31 %% iprop!
32 SHAPE (constant, scalar) is the measure shape __Measure.GLOBAL__.
33 %%% idefault!
34 Measure.GLOBAL
```

1 DegreeAv is a child of Degree.

```
36 %% iprop!
37 SCOPE (constant, scalar) is the measure scope __Measure.UNILAYER__
38 %%% idefault!
39 Measure.UNILAYER
41 %%% iprop!
42 PARAMETRICITY (constant, scalar) is the parametricity of the measure
       __Measure.NONPARAMETRIC__.
43 %%% idefault!
44 Measure.NONPARAMETRIC
46 %% iprop!
47 COMPATIBLE_GRAPHS (constant, classlist) is the list of compatible graphs.
48 %%% idefault!
49 {'GraphWU' 'GraphBU' 'MultigraphBUD' 'MultigraphBUT' 'MultiplexWU' '
       MultiplexBU' 'MultiplexBUD' 'MultiplexBUT' 'OrdMxWU' 'OrdMxBU'}
51 %% iprop!
52 M (result, cell) is the average degree
53 %%% icalculate!
54 degree = calculateValue@Degree(m, prop); (1)
56 g = m.get('G');
58 degree_av = cell(g.get('LAYERNUMBER'), 1);
59 parfor li = 1:1:g.get('LAYERNUMBER')
      degree_av(li) = {mean(degree{li}));
60
61 end
63 value = degree_av;
```

(1) calculates the value of the degree calling its parent Degree.

Code 6: DegreeAv element tests. The tests section from the element generator _DegreeAv.gen.m. ← Code 3

```
1 %% itests!
3 %% iexcluded_props!
4 [DegreeAv.PFM]
6 %% itest!
7 %%% iname!
8 GraphWU
9 %%% iprobability!
10 .01
11 %%% icode!
12 B = [
13 0 .6 1
   .6 0 0
     1 0 0
15
16
18 known_degree_av = {mean([2 1 1])};
g = GraphWU('B', B);
22 m_outside_g = DegreeAv('G', g);
23 assert(isequal(m_outside_g.get('M'), known_degree_av), ...
      [BRAPH2.STR ':DegreeAv:' BRAPH2.FAIL_TEST], ...
      [class(m_outside_g) ' is not being calculated correctly for ' class(g)
```

```
27 m_inside_g = g.get('MEASURE', 'DegreeAv');
28 assert(isequal(m_inside_g.get('M'), known_degree_av), ...
29 [BRAPH2.STR ':DegreeAv:' BRAPH2.FAIL_TEST], ...
           [class(m_inside_g) ' is not being calculated correctly for ' class(g)
```

Implementation of Distance

Now we implement the binodal measure Distance, again highlighting the differences.

Code 7: Distance element header. The header section of generator code for _Distance.gen.m provides the general information about the Distance element. ← Code 1

```
1 %% iheader!
Distance < Measure (m, distance) is the distance.</pre>
4 %% idescription!
_{\rm 5} The distance of a graph is the shortest path between all pairs of nodes
      within a layer of the graph.
6 For weighted graphs, the distance is calculated with the Dijkstra algorithm
      using the inverse weight as the distance associated to the edge.
```

Code 8: **Distance element prop update.** The props_update section of generator code for _Distance.gen.m updates the properties of the Measure element. ← Code 2

```
1 %% iprops_update!
3 %%% iprop!
4 NAME (constant, string) is the name of the distance
5 %%% idefault!
6 'Distance'
8 %% iprop!
9 DESCRIPTION (constant, string) is the description of the distance
10 %%% idefault!
_{\mbox{\tiny 11}} 'The distance of a graph is the shortest path between all pairs of nodes
       within a layer of the graph. For weighted graphs, the distance is
       calculated with the Dijkstra algorithm using the inverse weight as the
       distance associated to the edge.'
13 %% iprop!
14 TEMPLATE (parameter, item) is the template of the distance
17 ID (data, string) is a few-letter code of the distance
18 %%% idefault!
19 'Distance ID'
21 %% iprop!
22 LABEL (metadata, string) is an extended label of the distance
23 %%% idefault!
24 'Distance label'
26 %% iprop!
27 NOTES (metadata, string) are some specific notes about the distance
28 %%% idefault!
29 'Distance notes'
31 %% iprop!
32 SHAPE (constant, scalar) is the measure shape __Measure.BINODAL__
33 %%% idefault!
34 Measure.BINODAL
```

```
36 %% iprop!
37 SCOPE (constant, scalar) is the measure scope __Measure.UNILAYER___
38 %%% idefault!
39 Measure.UNILAYER
41 %%% iprop!
42 PARAMETRICITY (constant, scalar) is the parametricity of the measure
       __Measure.NONPARAMETRIC__.
43 %%% idefault!
44 Measure.NONPARAMETRIC
45
46 %% iprop!
47 COMPATIBLE_GRAPHS (constant, classlist) is the list of compatible graphs.
48 %%% idefault!
49 {'GraphBD' 'GraphBU' 'GraphWD' 'GraphWU' 'MultigraphBUD' 'MultigraphBUT' '
       MultiplexBD' 'MultiplexBU' 'MultiplexWD' 'MultiplexWU' 'MultiplexBUD' '
       MultiplexBUT' 'OrdMxBD' 'OrdMxBU' 'OrdMxWD' 'OrdMxWU'}
50
51 %%% iprop!
52 M (result, cell) is the distance
53 %%% icalculate!
54 g = m.get('G');
55 A = g.get('A');
57 distance = cell(g.get('LAYERNUMBER'), 1);
58 connectivity_type = g.get('CONNECTIVITY_TYPE', g.get('LAYERNUMBER'));
59 connectivity_type = diag(connectivity_type);
60 Aii_tmp = {};
61 for li = 1:1:g.get('LAYERNUMBER')
      Aii_tmp{li} = A{li, li};
62
63 end
64 for li = 1:1:g.get('LAYERNUMBER')
      Aii = Aii_tmp{li};
66
      connectivity_layer = connectivity_type(li);
67
      if connectivity_layer == Graph.WEIGHTED % weighted graphs
68
           distance(li) = {getWeightedCalculation(Aii)}; (1)
69
      else % binary (i.e., non-weighted) graphs
           distance(li) = {getBinaryCalculation(Aii)}; (2)
      end
72
73 end
74
75 value = distance;
76 % icalculate_callbacks! (3)
function weighted_distance = getWeightedCalculation(A)
78
                                                                                      measure.
79 end
80 function binary_distance = getBinaryCalculation(A)
81
```

Code 9: Distance element tests. The tests section from the element generator _Distance.gen.m. ← Code 3

```
1 %% itests!
3 %% iexcluded_props!
4 [Distance.PFM]
```

(1) and (2) call some callback functions that are provided below in (3)

(3) This section contains the callback functions for the calculation of the

```
6 %% itest!
7 %%%% iname!
8 GraphWU
9 %%% iprobability!
10 .01
11 %%% icode!
<sub>12</sub> B = [
<sub>13</sub> 0 .1
                 .2 .25 0
                0 0 0
0 .25 0
0 0 0
      .125 0
14
      .2
            .5
15
      .125 10
16
                  0 0 0
      0
            0
17
      ];
18
19
known_distance = {[
   0 5 5 4 Inf
5 0 2 1 Inf
5 2 0 3 Inf
4 1 3 0 Inf
     Inf Inf Inf Inf 0
25
      ]};
g = GraphWU('B', B);
30 m_outside_g = Distance('G', g);
_{31} assert(isequal(m_outside_g.get('M'), known_distance), ...
      [BRAPH2.STR ':Distance: BRAPH2.FAIL_TEST], ...
       [class(m_outside_g) ' is not being calculated correctly for ' class(g)
35 m_inside_g = g.get('MEASURE', 'Distance');
_{36} assert(isequal(m_inside_g.get('M'), known_distance), ...
      [BRAPH2.STR ':Distance: BRAPH2.FAIL_TEST], ...
       [class(m_inside_g) ' is not being calculated correctly for ' class(g)
40 . . .
```

Implementation of Triangles

Now we implement the nodal measure Triangles, again highlighting the differences. The parts of the code that are modified are highlighted.

Code 10: **Triangles element header.** The header section of generator code for _Triangles.gen.m provides the general information about the Triangles element. ← Code 10

```
2 %% iheader!
3 Triangles < Measure (m, triangls) is the triangles.</pre>
5 %% idescription!
6 The triangles are calculated as the number of neighbours of a node that are
       also neighbours of each other within a layer.
_{7} In weighted graphs, the triangles are calculated as geometric mean of the
      weights of the edges forming the triangle.
```

Code 11: Triangles element calculate. The calculate section of _Triangles.gen.m utilizes the rule property to select which algorithm it will use to calculate the Triangles element. ← Code 11

```
2 %% iprops_update!
4 %%% iprop!
_{\rm 5} NAME (constant, string) is the name of the {\it triangles}
6 %%%% idefault!
7 'Triangles'
9 %% iprop!
10 DESCRIPTION (constant, string) is the description of the triangles
11 %%% idefault!
_{12} 'The triangles are calculated as the number of neighbours of a node that are
       also neighbours of each other within a layer. In weighted graphs, the
       triangles are calculated as geometric mean of the weights of the edges
       forming the triangle.'
13
14 . . .
16 %% iprop!
17 M (result, cell) is the triangles
18 %% icalculate!
19 g = m.get('G'); % graph from measure class
_{20} A = g.get('A'); % cell with adjacency matrix (for graph) or 2D-cell array (
      for multigraph, multiplex, etc.)
L = g.get('LAYERNUMBER');
23 triangles = cell(L, 1);
25 directionality\_type = g.get('DIRECTIONALITY\_TYPE', L);
26 for li = 1:1:L
27 Aii = A{li, li};
29 if directionality_type == Graph.UNDIRECTED % undirected graphs
_{30} triangles_layer = diag((Aii.^(1/3))^3) / 2;
```

```
31 triangles_layer(isnan(triangles_layer)) = 0; % Should return zeros, not NaN
32 triangles(li) = {triangles_layer};
34 else % directed graphs
35 directed_triangles_rule = m.get('RULE'); (1)
36 switch lower(directed_triangles_rule)
37 case 'all' % all rule
_{38} triangles_layer = diag((Aii.^(1/3) + transpose(Aii).^(1/3))^3) / 2;
39 case 'middleman' % middleman rule
40 triangles_layer = diag(Aii.^(1/3) * transpose(Aii).^(1/3) * Aii.^(1/3));
_{4^{1}} case 'in' \% in rule
triangles_layer = diag(transpose(Aii).^(1/3) * (Aii.^(1/3))^2);
43 case 'out' % out rule
44 triangles_layer = diag((Aii.^(1/3))^2 * transpose(Aii).^(1/3));
45 otherwise % {'cycle'} % cycle rule
46 triangles_layer = diag((Aii.^(1/3))^3);
47 end
48 triangles_layer(isnan(triangles_layer)) = 0; % Should return zeros, not NaN
49 triangles(li) = {triangles_layer};
50 end
51 end
52 value = triangles;
54 % iprops!
55 %% iprop!
_{56} rule (parameter, OPTION) is the rule to determine what is a triangle in
       directed networks. (2)
57 %%% isettings!
58 {'all' 'middleman' 'in' 'out' 'cycle'}
59 %%% idefault!
60 'cycle'
```

(1) check for measure Triangle rules in

(2) these are the available triangle rules.