

How Does Popularity Diffuse in a Wikipedia Sub-Graph?

The Wikigraph

Starting from an initial Wikipedia Page, this group of functions built the weighted graph of depth 2 (we consider only links with multiplicity > 1). Multiplicity is our weight.

Built the Graph

```
initialTitle = "Star_Trek_Into_Darkness";
```

```
Needs["GraphUtilities`"]
```

```
cleanlinks[links_] := Module[
  {cleanedlinks},
  cleanedlinks = Select[
    links,
    StringMatchQ[#, "http://en.wikipedia.org/wiki/"~~Except[":"].] &
  ];
  cleanedlinks = Select[ Gather[DeleteCases[cleanedlinks,"http://en.wikipedia.org/wi
Tally@Flatten[cleanedlinks]
  (*First /@ cleanedlinks*)
]
(*this function will consider links multiplicity and links with at least 2 repetitions
```

```
importFirstLevelLinks[init_] := cleanlinks @
  Import["http://en.wikipedia.org/wiki/"<>init, "Hyperlinks"]
(* this output is a list of weighted links with their multiplicity *)
```

```
createFirstLevelWeightedEdges[init_,weightedlinks_] :=
{init,Last@StringSplit[#[[1]],"/"],#[[2]]}& /@ weightedlinks
```

```
findFirstNeighbors[firstLevelLinks_] := Last@StringSplit[#, "/" ]& /@firstLevelLinks[[All
```

```
importSecondLevelLinks[firstLevelLinks_] := (cleanlinks @ Import[#, "Hyperlinks"])& /@ f
```

```
createSecondLevelWeightedEdges[firstNeighbors_,secondLevelLinks_] :=
Module[{secondNeighbors,secondNeighborsWeighted},
  secondNeighbors=Map[Last[StringSplit[#, "/"]]&,secondLevelLinks[[All,All,1]],{2
  secondNeighborsWeighted=Transpose[{secondNeighbors[[#]],secondLevelLinks[[#,Al
  Flatten[Outer[
    Flatten[{#1,#2}]&,{firstNeighbors[[#]]},{secondNeighborsWeighted[[#]]},2]&
]
```

```
createTheGraph[init_] := Module[{firstLevel, secondLevel},
  firstLevel = importFirstLevelLinks[init];
  secondLevel = importSecondLevelLinks[firstLevel];
  Flatten[{createFirstLevelWeightedEdges[init, firstLevel], createSecondLevelWeightedEdges[init, secondLevel]}
]
```

Remove Self Loops

```
NoSelfLoopGraph[EdgesList_] := DeleteCases[EdgesList, {a_, a_, __}]
```

Correct Multiplicity: remove Multi Edges and update Weights

```
NewGraphWithCorrectMultiplicity[Edges_] := Module[{unweighted, repetitions, positions,
  replaceIndices, deleteIndices, updates, subs, checkedFirst, checkedFinal},
  unweighted = Edges[[All, ;; 2]];
  repetitions = Select[Tally[unweighted], (#[[2]] > 1) &];
  positions = Position[unweighted, #[[;; 2]]] &@@@ repetitions;
  replaceIndices = positions[[All, 1]];
  deleteIndices = positions[[All, 2]];
  updates = Partition[Flatten[{Edges[[#1[[1]], ;; 2]], Edges[[#1[[1]], 3]] + Edges[[#1[[1]], 3]]}, {2}];
  subs = Map[#1[[1, 1]] -> #[[2]] & , Transpose[{replaceIndices, updates}]];
  checkedFirst = ReplacePart[Edges, subs];
  checkedFinal = Delete[checkedFirst, deleteIndices];

  (*this function controls and corrects repetitions in the graph, just use it once*)
]
```

Operations on the Graph

Static visualization with Weights or Ranks

```
FancyRankingGraph[list_, ranks_, title_, center_] :=
  Graph[DirectedEdge @@@ list,
    VertexSize -> ranks, GraphHighlight -> {center},
    PlotLabel -> Framed[Style[title, 15, "Arial"],
      Background -> LightBlue], VertexSize -> 1, ImageSize -> 700, GraphLayout -> "SpringElectrical",
    VertexLabels -> {center -> Framed[Style[center, 15, "Arial"], Background -> White]}
]
```

```
NormRankings[rankings_] :=
  With[{mean = Mean[rankings[[All, 2]]]},
    (# -> N[#/mean] & @@@ rankings)
  ]
```

Dynamic visualization with Popularity

```
AssignDynamicWeights[Vertices_, TimeSeries_] :=
  MapThread[#1 -> Flatten[#2[[All, All, 2]]] &, {Vertices, TimeSeries}]
```

```
PopWeightedGraph[list_, weights_, title_, center_] := Graph[DirectedEdge @@@ list,
VertexSize -> weights, GraphHighlight -> {center},
PlotLabel -> Framed[Style[title, 15, "Arial"],
Background -> LightBlue], VertexSize -> 1, ImageSize -> 700, GraphLayout -> "SpringElectricalEmbedding",
VertexLabels -> {center -> Framed[Style[center, 15, "Arial"], Background -> White]}]
```

```
DynamicPopularity[Edges_, popweights_] := Manipulate[
  With[
    {mean = Mean[Flatten[popweights[[All, 2]]]}},
    PopWeightedGraph[Edges, #1 → N[#2[[w]] / mean] & @ @ popweights
    , "Avatar, popularity", "Avatar_%282009_film%29"
  ]
  , {{w, 1}, 1, Length[popweights[[1, 2]]], 1}]
```

Popularity Time Series

Extract Time Series for a set of Wikipedia Pages

Where? [http : // stats.grok.se/json/en/](http://stats.grok.se/json/en/)

Given a list of Titles of Wikipedia Pages this function extract the time series for the chosen dates (in months), and print the results on a json file.

```
importingOnFile[dates_List,pages_,outputfile_]:=
Do[
  (Import["http://stats.grok.se/json/en/"<>#1<>"/"<>pages[[i]], "JSON"]>>
    "/Users/Levantina/Documents/WOLFRAM/PROJECT/Timeseries/"<>outputfile) & /@ dat
  ,
  {i,Length[pages]}]

(*dates_List = {"200910","200911","200910",...} in months, in crescent order, pages = 1
```

Process and Plot Time Series

This function read from file the time series, knowing how many months.

```
readingTimeSeries[file_,months_]:=ReadList["/Users/Levantina/Documents/WOLFRAM/PROJECT
```

```
CleanTimeSeries[series_] := {FromDigits /@ StringSplit[#, "-"], #2} & @@@ series[[1, 2]]
```

This function cleans imported data and makes them ready to be plotted.

```
ExtractTimeSeries[imported_List, Nmonths_Integer] := Partition[CleanTimeSeries[#] & /@ imp
```

This function is useful to study the average behaviour of a random sample of pages.

```
averageTimeSeries[cleanedTS_] := N@Mean[Flatten[cleanedTS[[#, All, All, 2]]] & /@ Range[1, Le
```

This function plots the popularity for the selected Vertex:

```
PlotTimeSeries[series_,opts___]:= DateListPlot[series,Joined ->True,opts]
```

```
ShowTimeSeries[index_,vertices_,imported_List,Nmonths_Integer]:=
  PlotTimeSeries[
    ExtractTimeSeries[imported,Nmonths][[index]],
    PlotRange->All,PlotLabel->vertices[[index]]
  ]
]
```

This function correct the weekly fluctuation effect:

```
Corrections[daily_,timeseries_]:=
  Map[#/Flatten[Table[daily,{9}]]&,&Length[#]] &, timeseries,{1}]
```

```
ex = Import["/Users/Levantina/Documents/WOLFRAM/PROJECT/startrekNetwork/
  allStarTrekWeighted.tsv", "TSV"];
```

```
Length[NewGraphWithCorrectMultiplicity[ex]]
```

```
3126
```

Correlations between Time Series

```
FastCorrelations[timeseries_]:=With[{matrix=If[
  StandardDeviation[#]>0,N[(#-Mean[#])/(StandardDeviation[#]*Sqrt[Length[#]])],
  Table[0.,{Length[#]}]&/@timeseries},
  matrix.Transpose[matrix]
]
```

We can transform the correlation in a distance in the graph:

$d(i,j) = \text{Sqrt}[2*(1-\text{corr}(i,j))]$

$d = \{0 \text{ correlated}, \text{Sqrt}[2] \text{ not correlated}, 2 \text{ anticorrelated}\}$

```
DistancesFromCorrelationMatrix[matrix_]:= Sqrt[2*(1-#)] & /@ matrix
```

Adjacency Matrix

To put 0 s on the diagonal (for Array Plot)

```
removingSelfLoops=(-1)*(IdentityMatrix[65]-1);
```

To visulaize with the function Graph, to put Infinity to disconnect vertices

```
InfiniteDiagonal=Map[ If[#==1,Infinity,1]& ,IdentityMatrix[65],{2}];
```

Link Prediction

```
LinkPrediction[d_,popi_,popj_,DistThreshold_,PopThreshold_]:= If[d>DistThreshold,
d*Sqrt[popi*popj],
If[popi*popj>PopThreshold,d*Sqrt[popi*popj],0]]
```

```
GraphPrediction[adjMatrix_,popularities_,DistThreshold_,PopThreshold_]:=Map[LinkPredic
popularities[[#][1]],popularities[[#][2]],DistThreshold,PopThreshold]&,
Table[{i,j},{i,1,Length[adjMatrix[[1]]},{j,1,Length[adjMatrix[[1]]]}],{2}];
```