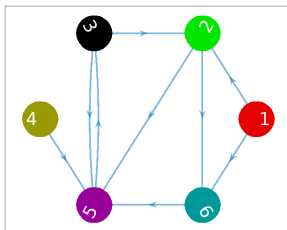


CS319: Scientific Computing (with MATLAB)

(PageRank) and Review of CS319

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Important: you should read:

- The MATLAB Guide, Chapters 19 and 21: <https://doi-org.nuigalway.idm.oclc.org/10.1137/1.9781611974669>

This week...

1 1. Projects (last time!)

2 3: Directed Graphs

3 6: PageRank

- Other Applications

4 Module review

- Not covered

- THE END!

1. Projects (last time!)

The slides for this section are at <https://www.niallmadden.ie/2223-CS319/2223-CS319-Projects.pdf>

3: Directed Graphs

Last week, we learned about the MATLAB class for representing (undirected) **graphs**. Now we'll look at the class for **undirected** graphs, called *digraph*,

The notes for this section are in the MATLAB live script, *CS319_Week12_PageRank.mlx*.

You can access it in the **Week12** folder in <https://bitbucket.org/niallmadden/2223-cs319/src/main/> or from <https://www.niallmadden.ie/2223-CS319/>



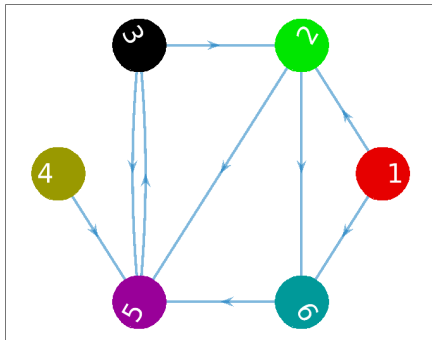
6: PageRank

Google initial break-through in search engine design was derived from their **PageRank** algorithm which gives an objective way of computing the relative importance of web-pages.

The basic idea is this: **the importance of a web-page is the probability that you are looking at it at any given time.**

6: PageRank

To see how this works, consider the following example, which was made in the live script.



6: PageRank

The method:

- (1) Form the **adjacency matrix**, $A = (a_{ij})_{i=1}^N$, for the network:

$$a_{i,j} = \begin{cases} 1 & \text{if the graph has an edge from Node } i \text{ to Node } j; \\ 0 & \text{otherwise.} \end{cases}$$

- (2) Make the associated **Markov matrix**, $S = (s_{ij})_{i=1}^N$, where $S_{i,j}$ is the *proportion* of vertices in A which start at i and go to j . (That is, divide the entries in row i by the sum of the entries in that row). If there are no entries in a given row of A , set the corresponding entries of S to $1/N$.
- (3) Choose a “damping” value σ , e.g., $\sigma = 0.85$.
- (4) Set the matrix G to be $(\sigma S + (1 - \sigma)/N)^T$.
- (5) Finally, find a “fixed point” vector x : should be $Gx = x$. This can be done with the **Power Method**. (Yes, it’s an eigenvector...).

6: PageRank

From our example earlier, the first few results are:

Iteration	0	1	2	3
u	$\begin{pmatrix} 0.1667 \\ 0.1667 \\ 0.1667 \\ 0.1667 \\ 0.1667 \\ 0.1667 \end{pmatrix}$	$\begin{pmatrix} 0.0250 \\ 0.1667 \\ 0.1667 \\ 0.0250 \\ 0.4500 \\ 0.1667 \end{pmatrix}$	$\begin{pmatrix} 0.0250 \\ 0.1065 \\ 0.4075 \\ 0.0250 \\ 0.3296 \\ 0.1065 \end{pmatrix}$	$\begin{pmatrix} 0.0250 \\ 0.1746 \\ 0.3084 \\ 0.0250 \\ 0.3612 \\ 0.1059 \end{pmatrix}$

These days, PageRank is only a minor part of what the Google Search Engine does. However, the methodology has been applied to lots of different application domains including

- ▶ Biological sciences and genomics,
- ▶ Election systems (at least in theory)
- ▶ Ranking Sports Teams (very effective if you want a complete ranking of all teams in an event that features group stages followed by knock-out.
- ▶ Ranking academic papers based on their citations,
- ▶ Etc, etc.

Reminder of CS319 Assessment

The final grade for CS319 is based on

- ▶ **Four lab assignments** (40%).
- ▶ Class-test (20%)
- ▶ The project (40%)

This module does not have an end-of-semester exam.

- ▶ Resit of Class Test today at 16.00. Run on a no-risk basis.
- ▶ Deadline for Project Code and Report: 5pm Thu, 6 April.

Module review

The topics we have covered (not necessarily in order) are:

- (a) MATLAB Basic I/O, including reading to and writing from files
- (b) Flow of control and looping (`if`, `for`, `while`, etc.)
- (c) Fundamental data-types (`int32`, `double`, `char`, `logical`, ...).
- (d) strings
- (e) Computer representation of numbers (underflow, overflow, machine epsilon, ...)
- (f) Vectors and matrices; vector indexing.

Module review

- (g) Functions: inline and “file” functions.
- (h) Optimisation and bisection;
- (i) Random number generation.
- (j) Sorting algorithms, and their complexities;
- (k) Data fitting with polynomials, and piecewise polynomials.
Least squares. Convergence.
- (l) Solving linear systems by the Jacobi and Gauss-Seidel methods, and using backslash.

Module review

- (m) Sparse matrix representation, especially triplet and CCS;
Matrix-vector multiplication
- (n) Direct and iterative solvers, and preconditioning.
- (o) Graphs, Digraphs, and adjacency matrices;
- (p) PageRank and the Power Method;
- (q) Classes, and operator overloading.

Some topics that would have been nice...

1. Non-polynomial data-fitting (optimisation)
2. More on linear solvers, especially
 - ▶ more preconditioners
 - ▶ why Krylov methods work
 - ▶ LU and Cholesky decomposition.
3. More on eigenvalue problems, especially for sparse matrices.
4. Differential equations.
5. Montecarlo methods.
6. Parallel and distributed computing.
7. The App Builder.

I hope you have enjoyed CS319, and have learned something: I have!

Thank you for your participation, enthusiasm, forbearance, and willing to help each other.

