

# CAAM 440 · APPLIED MATRIX ANALYSIS

## Problem Set 4

Posted Friday 9 March 2012. Due Monday 19 March 2012.

This assignment asks you to read and report upon a recent survey article on *tensors*, a generalization of vectors and matrices that has become increasingly important prominent in the matrix theory community over the past decade.

Download the article: “Tensor Decompositions and Applications” by Tamara G. Kolda and Brett W. Bader, *SIAM Review* 51 (2009) 455–500: <http://dx.doi.org/10.1137/07070111X>.

Read the article, paying particular attention to Sections 1, 2, 3, 4, 5.7, 6, 7 (i.e., skim most of Section 5).

Write-up a digest of this article. Your report should conform to the following specifications.

1. Type your report (using L<sup>A</sup>T<sub>E</sub>X or your favorite word processor).
2. The report should be at least two pages and *no more than five pages*.
3. You may work alone, or with one other student. (In the latter case, submit one report, and clearly indicate the names of both authors.)
4. *Do not quote at length from the article*. Read, digest, and explain in your own words.
5. Address the following points:
  - (a) What is a tensor?
  - (b) Define key terms, such as *fiber*, *slice*, *mode*, *rank-one tensor*, etc.
  - (c) Describe the CANDECOMP/PARAFAC decomposition, explaining how it is a generalization of the “dyadic form” of the singular value decomposition,

$$\mathbf{A} = \sum_{j=1}^r \sigma_j \mathbf{u}_j \mathbf{v}_j^*.$$

What is the *rank* of a tensor, and why is it difficult to calculate? Is the decomposition unique? How (very roughly) is it calculated?

- (d) How does the Tucker decomposition differ from the CP decomposition? What is the HOSVD? Is it easier or harder to calculate than the CP decomposition?
- (e) For matrices, truncating the SVD after  $k$  terms gives the optimal rank- $k$  approximation to a matrix. Is the same true for the CP or HOSVD tensor factorizations?
- (f) What part of the article did you find most interesting?
- (g) What part of the article did you find difficult to understand?
- (h) Go beyond the paper in some way: for example, track down one of the many citations to the applications literature, and briefly describe how tensors are used in an area that interests you; or download the MATLAB “Tensor Toolbox” and do some numerical calculations. You could numerically verify the claim on page 465 about the percentage of  $2 \times 2 \times 2$  tensors that have rank 2 or 3, or you could construct a numerical example to illustrate the best-approximation example on page 469.

Grading: This assignment will be weighted equally with the other unpledged problem sets.

You will be graded as follows: (a) = 5 points, (b) = 10 points, (c) = 15 points, (d) = 15 points, (e) = 10 points, (f) = 5 points, (g) = 5 points, (h) = 15 points; quality of writing and clarity of exposition: 20 points.