## Math 160 - Project 1

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Problem No.2

## Problem No.3

- (i) Theory of Singular value decomposition allows us to decompose the matrix G as a sum of many rank-one matrices. Rank of a matrix is defined as the maximum number of linearly independent column vectors. Using this fact, we can give a ranking because there's only one linearly independent column vector which implies that it will scale the values of the difficulty score the students gave for each questions. Thus, The lowest value of the rating will be the most difficult.
- (ii) Massey least square method calculates the sum of score differential between two teams in this case two questions. It output the ratings/difficulty of each question by approximately solving the system of linear equality (the score difference) between all of the questions. The output with the greatest value would be the would be considered easiest.
- (iii) The Results

## Problem No.4

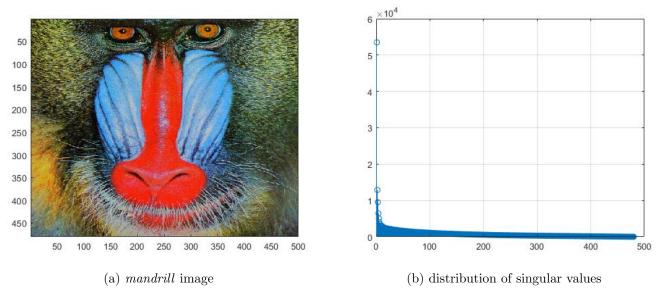


Figure 1: The image (left) along with the distribution of its singular values (right).

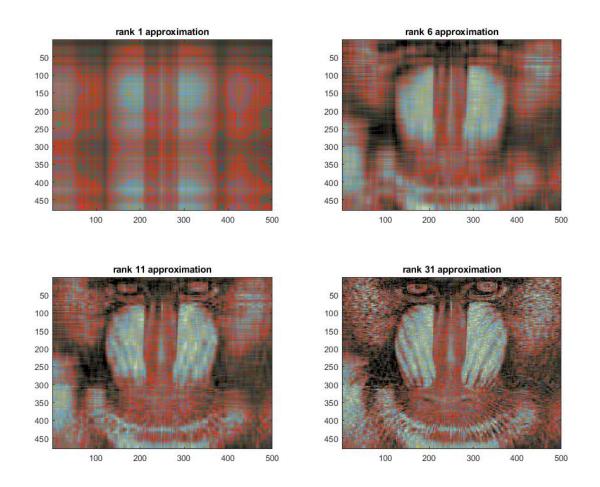


Figure 2: Four different approximation for the image based on the rank.

	Absolute Error	Relative Error
Rank 1 approximation	12891.1649	$1.2699e^{-15}$
Rank 6 approximation	3537.8836	$6.4268e^{-16}$
Rank 11 approximation	2820.0648	$6.4502e^{-16}$
Rank 31 approximation	1985.461	$4.5808e^{-16}$

Figure 3: The absolute error (norm) along with relative error of the approximation of image based of the rank.