

In some situations, the reliability of a measurement is known to vary. For example, one could imagine a situation where the measurement mechanism goes through a “warm up” period, leading to less reliable measurements early in the measurement period but becoming more reliable in time. Statisticians call data with varying reliability *heteroscedastic*.

In the file `heteroscedastic.txt`, are 20 data points,  $(t_i, y_i)$ ,  $i = 1, \dots, 20$ . Presumably these are samples from a “true data function” that maps  $\mathbb{R} \rightarrow \mathbb{R}$ .

- a. Choose a reasonable basis for this problem and construct the system matrix
- b. Find the parameters characterizing the best-fit line in a least-squares sense.
- c. Now suppose that you know, *a priori* that doubt about the reliability, or the uncertainty, in your data follows the function  $\sigma(t) = 20e^{-t/2}$ . Construct a diagonal  $20 \times 20$  weighting matrix  $S$  with entries  $1/\sigma^2$  corresponding to the timestamp for each point in your dataset.
- d. Use the above matrix  $S$  to solve a weighted least squares problem ( $\hat{y} = SA\theta$ ) and report the parameters characterizing its best-fit line. Plot both the least squares and weighted least squares lines on a plot with the data so you can compare the fits.
- e. Write a short summary of your observations, particularly considering how  $S$  may relate to Fisher information. If you didn't have *a priori* knowledge about the reliability of your data, what could you do (if anything) to estimate it from the data itself? When would your scheme work well? When would it fail?