## **Exercise: Shrinkage in linear regression**

(Source: Jaakkola.) Consider performing linear regression with an orthonormal design matrix, so  $||\mathbf{x}_{:,k}||_2^2 = 1$  for each column (feature) k, and  $\mathbf{x}_{:,k}^T \mathbf{x}_{:,j} = 0$ , so we can estimate each parameter  $w_k$  separately. Figure 1 plots  $\hat{w}_k$  vs  $c_k = 2\mathbf{y}^T \mathbf{x}_{:,k}$ , the correlation of feature k with the response, for 3 different esimation methods:

ordinary least squares (OLS), ridge regression with parameter  $\lambda_2$ , and lasso with parameter  $\lambda_1$ .

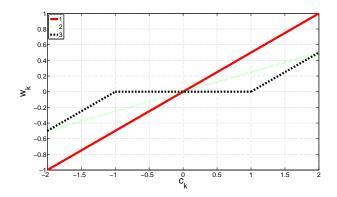


Figure 1: Plot of  $\hat{w}_k$  vs amount of correlation  $c_k$  for three different estimators.

- 1. Unfortunately we forgot to label the plots. Which method does the solid (1), dotted (2) and dashed (3) line correspond to?
- 2. What is the value of  $\lambda_1$ ?
- 3. What is the value of  $\lambda_2$ ?