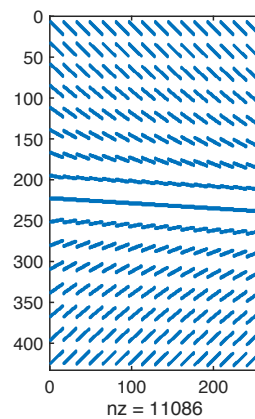


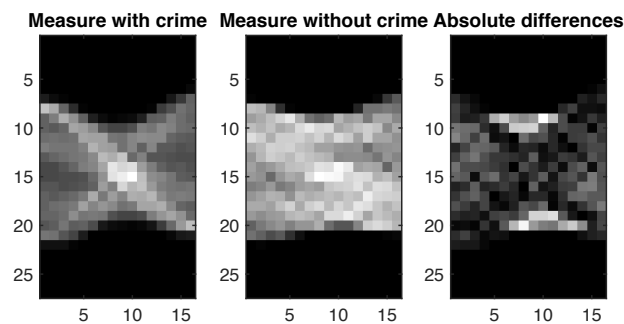
## 1 Exercise 2

### 1.1 Naïve reconstruction

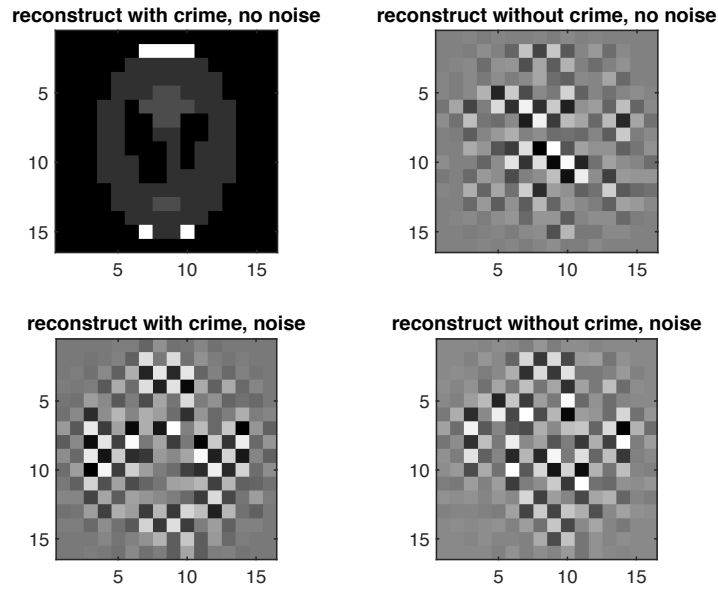
Run “XRMA\_matrix\_comp.m” with  $N = 16$ . Matrix A is sparse matrix:



Data with crime and without crime are shown in the below figure. The absolute differences are shown in the right figure.

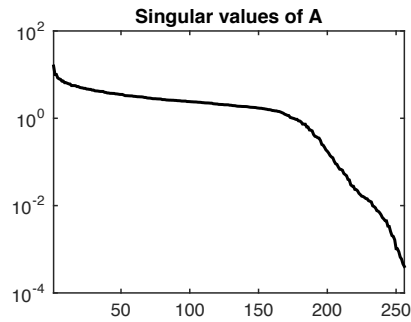


Naïve reconstruction of data with inverse-crime and without inverse-crime is shown in the below figure. We can see that the results are useless in case the measurement has noise.

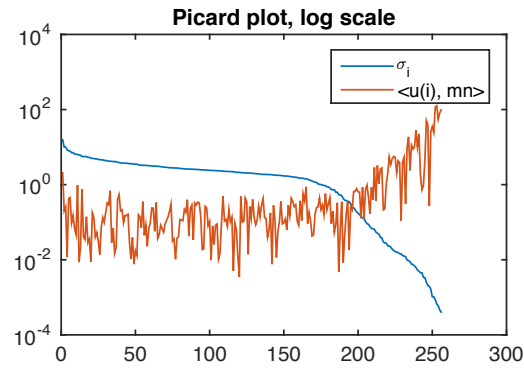


## 1.2 TSVD

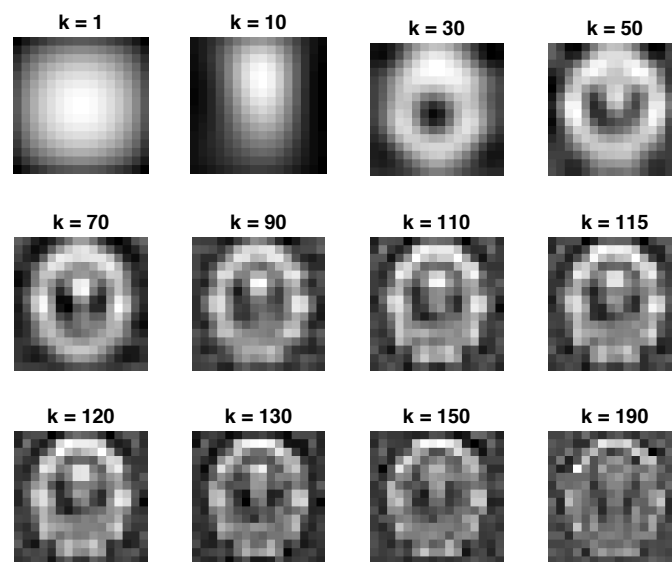
Decompose  $A$  to  $[U \ S \ V]$ . The decay of singular values is shown in below figure. The singular values decrease dramatically from the element 160.



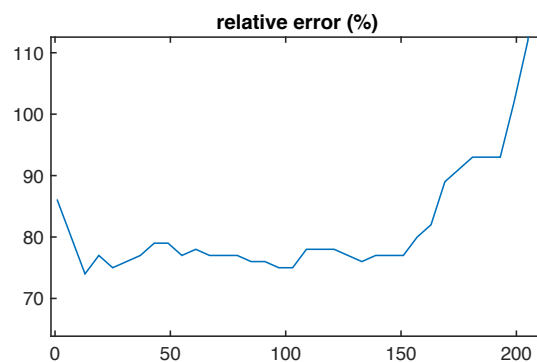
Picard plot: The decay speed of singular value  $\sigma_i$  and  $|\langle u_i, b \rangle|$ . We can see that the Picard condition break after around  $k = 150$ , when  $|\langle u_i, b \rangle|$  starts having increase trend.



Reconstructed image in relation to number of truncated value



From observation, a good result is reconstructed with truncate value  $k \sim 130$ . The relative error graph shows that the errors are quite same with  $k = 30:150$ . This may be the results of low resolution of test problem and high noise.



## 2 Exercise 3

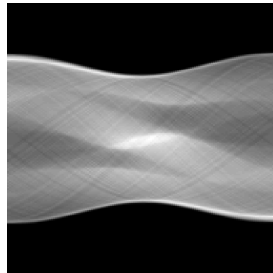
### 2.1 Simulate tomographic data

Shepp-Logan phantom at size 128x128

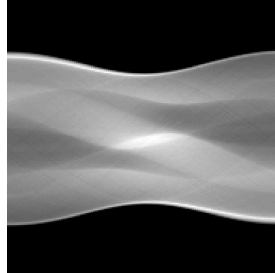


Dummy data

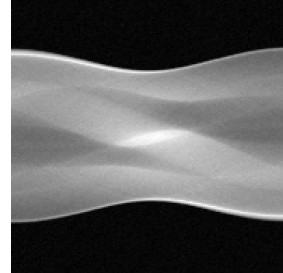
measurement WITH inverse crime



measurement WITHOUT inverse crime



noisy measurement WITHOUT inverse crime



Dummy measurement

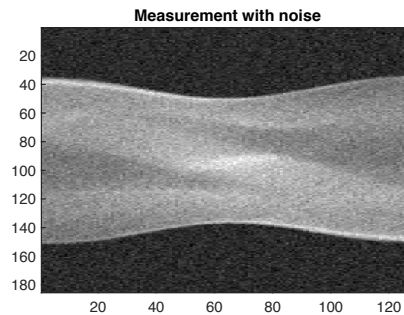
### 2.2 Reconstruction using back-projection

Filtered back-projection reconstruction: error 29%

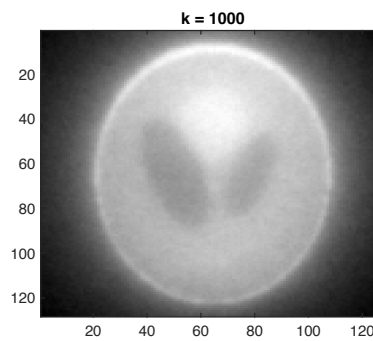


## 2.3 CGLS

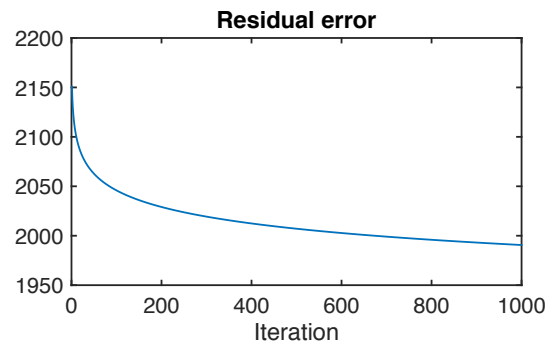
Modify CGLS by replacing:  $Ax$  by  $\text{radon}(x, \theta)$  and  $A'b$  by  $\text{iradon}(b, \theta)$ .



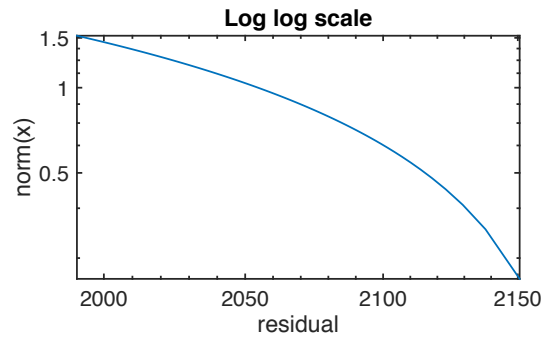
Constructed by CGLS



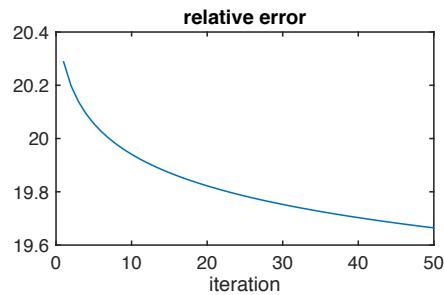
Residual error continues to decrease, but stay quite large



The L-curve is not formed



Relative error continues decreasing but still stay quite large.



## 2.4 Discrepancy principle

Pick  $k$  that's

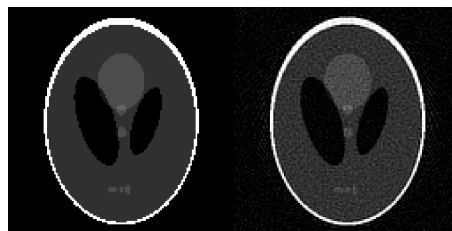
$$\|Ax_k - b\|_2 > \nu_{dp} \|e\|_2 > \|Ax_{k+1} - b\|_2$$

Here noise level is 1%:  $\|e\|_2 = 0.01 \|b\|_2 = 0.33$

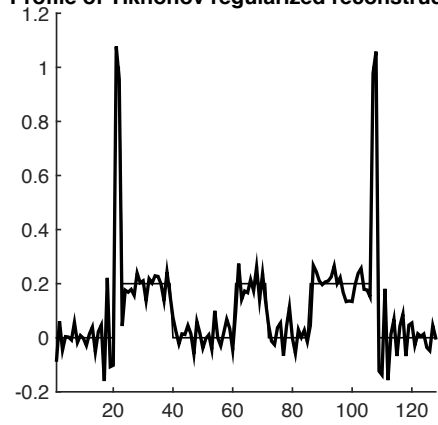
However, there is an error in implementation of CGLS that keep residual error high. I have not fix this.

## 2.5 Matrix-free X-ray tomography

Tikhonov regularization: error 33%

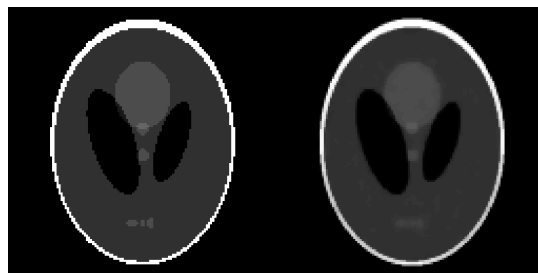


Profile of Tikhonov regularized reconstruction

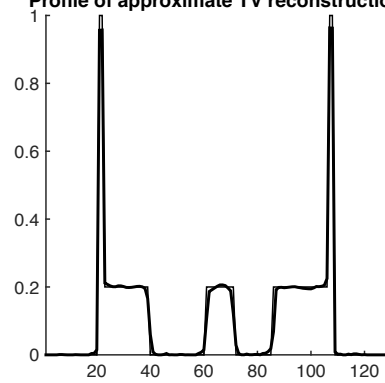


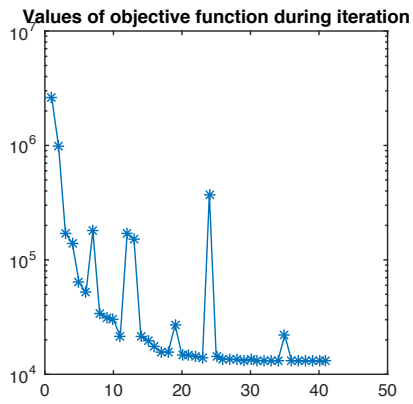
## 2.6 Total variation regularization

Approximate TV: error 27%



Profile of approximate TV reconstruction





There is some jumps in the objective function.

## 2.7 Summary

Total variation gives the best solution because the target is piecewise constant.