

Exercise-Sheet-B

March 31, 2021

1 Exercise sheet B - Template

```
[36]: # Some imports
import numpy as np
import scipy.sparse as sp
import scipy.sparse.linalg as spla
```

1.1 Exercise 1

Define the correct matrix **A** and **b** for use with, e.g., `np.linalg.lstsq` or `scipy.linalg.lstsq` (see documentation), then call the least-squares solver appropriately.

Note: Both examples from the exercise sheet work the same way, just the matrices are different.

```
[9]: # UNCOMMENT AND COMPLETE
# A = np.array(...).astype('float32')
# b = np.array(...).astype('float32')
# ...
```

1.2 Exercise 2

Implement the Kaczmarz algorithm from the lecture (see [here](#)) and solve both problems from Exercise 1 with this algorithm.

Below is some **helper code**, e.g., to normalize the system of linear equations. Say you have

$$\mathbf{A} = \begin{pmatrix} 1 & 0 & 1 \\ 0 & 0 & 1 \end{pmatrix}$$

and

$$\mathbf{b} = [3, 4]^T$$

then `normalize_system` would work as follows:

```
[18]: A = np.array([[1,0,1],[0,0,1]]).astype('float32')
b = np.array([3,4]).astype('float32')
ret = normalize_system(A,b)
A_norm = ret[0]
b_norm = ret[1]
print(A_norm)
```

```
print(b_norm)
```

```
[[0.70710677 0.          0.70710677]
 [0.          0.          1.          ]
 [2.1213205  4.          ]]
```

Use `normalize_system` to create a normalized **A** and **b** that you use when calling your implementation of the Kaczmarz algorithm.

1.2.1 Termination criterion

As termination criterion compute

$$\mathbf{r}^{(k)} = \mathbf{b} - \mathbf{A}\mathbf{x}^{(k)}$$

and check

$$\|\mathbf{r}^{(k)}\|_2 \leq 10^{-6}$$

where the norm can be computed using `np.linalg.norm`.

Note: Inner products with `numpy` can easily be done either with `np.dot` or using the syntax `a @ b`.

1.2.2 Initialization

Initialize $\mathbf{x}^{(0)}$ as the vector of **all zeros**.

```
[1]: def compute_row_norms(A):
      if sp.issparse(A):
          return spla.norm(A, axis=1)
      return np.linalg.norm(A, axis=1)

      def normalize_matrix(A, row_norms):
          normalization_matrix = sp.diags(1 / row_norms)
          return normalization_matrix @ A

      def normalize_system(A, b):
          if not sp.issparse(A):
              A = np.array(A)

          row_norms = compute_row_norms(A)
          A = normalize_matrix(A, row_norms=row_norms)
          b = np.array(b).ravel() / row_norms

          return A, b, row_norms
```

```
[25]: def kaczmarz(A,b):  
      # YOUR CODE GOES HERE  
      # return x_k  
      pass
```