# Golub-Kahan-Lanczos bidiagonalization

Qingyu Huang 201703956

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### Introduction

The Golub-Kahan-Lanczos bidiagonalization factorization can be used on its own to solve linear systems and ordinary least squares problems, calculate the determinant and the (pseudo-)inverse of a matrix. But it mostly is used as the first step in the QR-like singular value decomposition (SVD) method, it also provides a powerful tool for solving large-scale singular value and related eigenvalue problems, as well as least-squares and saddle-point problems.

### **GKL** bidiagonalization

The Golub-Kahan-Lanczos bidiagonalization is

$$U^*AV = B = \begin{bmatrix} \alpha_1 \\ \beta_1 & \alpha_2 \\ & \beta_2 & \alpha_3 \\ & & \beta_3 & \ddots \\ & & & \ddots & \alpha_{n-1} \\ & & & & \beta_{n-1} & \alpha_n \end{bmatrix}$$

U and V are unitary matrices, and B is bidiagonal matrix. We take any  $m \times 1$  column vector b as a starting vector, and choose  $\beta_1 = ||b||$ ,  $u_1 = b/\beta_1$ ,  $\alpha_1 = ||A^T u_1||$  and  $v_1 = (A^T u_1)/\alpha_1$ .

#### Algorithm 1 Golub-Kahan-Lanczos Bidiagonalization procedure

```
1: Starting vector b, Choose \beta_1 = ||b||, u_1 = b/\beta_1, \alpha_1 = ||A^T u_1|| and v_1 = (A^T u_1)/\alpha_1.

2: for each j = 1, 2, \cdots do

3: u_{j+1} = Av_j - \alpha_j u_j

4: \beta_{j+1} = ||u_{j+1}||_2

5: u_{j+1} = u_{j+1}/\beta_{j+1}

6: v_{j+1} = A^T u_{j+1} - \beta_{j+1} v_j

7: \alpha_{j+1} = ||v_{j+1}||_2

8: v_{j+1} = v_{j+1}/\alpha_{j+1}

9: end for
```

# Implementation

We use GNU Scientific Library to implement the algorithm, suppose the size of matrix A is  $m \times n$ , m is the number of rows and n is the number of columns, so matrix A has three cases:  $\mathbf{m} = \mathbf{n}$ ,  $\mathbf{m} < \mathbf{n}$  and  $\mathbf{m} > \mathbf{n}$ . We will test these three cases in our c language program.

The program include two files: main.c and gkl\_bidiag.c. main.c include all the test code, gkl\_bidiag.c include the Golub-Kahan-Lanczos bidiagonalization factorization function gkl\_bidiag, the print\_matrix function for printing the matrix out, and the check\_matrix\_equal function used for checking whether two matrices equal or not.

When the size of matrix A is  $m \times n$ , suppose the minimum of m and n is p, the size of matrix U should be  $m \times p$ , the size of matrix V should be  $n \times p$ , and the size of bidiagnoal matrix B should be  $p \times p$ . First assign the start vector b to an arbitrary unit 2-norm vector, in our program we assign vector b as  $[1,0,0,\cdots,0]^T$ , then do every step exactly as the algorithm above and finally get the matrix U and matrix V, then group vector alpha and beta together to make the matrix B. The alpha vector is in the main diagonal of the matrix B, and beta vector is in the first diagonal below the main diagonal of the matrix B.

In the main program we randomly generate three different matrix with different size to represent m=n, m<n and m=n, we get matrix U,V and B of each matrix and then test  $U^*AV$  with the B, the difference between these two matrices are very small, the error is less than 1e-10.

### References

Galassi, M., et al. "GNU Scientific Library Reference Manual, ISBN 0954612078." Library available online at http://www.gnu.org/software/gsl (2015).

Sikurajapathi, Indunil. Computing the Leading Singular Values of a Large Matrix by Direct and Inverse Iteration. Skolan för datakunskap och kommunikation, Kungliga Tekniska högskolan, 2007.

## Appendix

```
1
  void gkl bidiag(gsl matrix* A,gsl matrix* U,
2
                    gsl matrix* B,gsl matrix* V)
3
  {
4
      int m=A->size1;
       int n=A->size2;
6
       int p=(m<n)? m:n;
7
8
      gsl vector* start=gsl vector alloc(m);
9
      gsl_vector* alpha=gsl_vector_alloc(p);
10
      gsl_vector* beta=gsl_vector_alloc(p);
11
      gsl_vector* tmp=gsl_vector_alloc(n);
12
      gsl vector* Vj=gsl vector alloc(n);
13
      gsl_vector* Uj=gsl_vector_alloc(m);
14
15
      gsl_vector_set(start,0,1);
16
      gsl_vector_set(beta,0,gsl_blas_dnrm2(start));
17
      gsl_vector_scale(start,1.0/gsl_blas_dnrm2(start));
19
      gsl matrix set col(U,0,start);
20
      gsl blas dgemv (CblasTrans, 1.0, A, start, 0, tmp)
21
22
      gsl_vector_set(alpha,0,gsl_blas_dnrm2(tmp));
23
      gsl vector scale(tmp,1.0/gsl blas dnrm2(tmp));
24
      gsl matrix set col(V,0,tmp);
25
26
27
      for (int j=0; j < p-1; j++)
28
29
```

```
gsl_matrix_get_col(Vj, V, j);
30
           gsl_matrix_get_col(Uj, U, j);
31
32
           gsl_blas_dgemv (CblasNoTrans, 1.0, A, Vj,
33
                        (-1)*gsl_vector_get(alpha,j), Uj);
34
35
           gsl_vector_set(beta,j+1,gsl_blas_dnrm2(Uj));
36
           gsl_vector_scale(Uj,1.0/gsl_blas_dnrm2(Uj));
37
38
           gsl_matrix_set_col(U,j+1,Uj);
39
40
41
42
           gsl_blas_dgemv (CblasTrans, 1.0, A, Uj,
43
                        (-1)*gsl_vector_get(beta,j+1), Vj);
44
           gsl_vector_set(alpha,j+1,gsl_blas_dnrm2(Vj));
45
           gsl_vector_scale(Vj,1.0/gsl_blas_dnrm2(Vj));
46
^{47}
           gsl_matrix_set_col(V,j+1,Vj);
48
49
       }
50
51
       for(int i=0; i<p; i++)
52
       {
           gsl_matrix_set(B,i,i,gsl_vector_get(alpha,i));
55
       for(int i=1; i<p; i++)
56
57
           gsl_matrix_set(B,i,i-1,gsl_vector_get(beta,i))
58
       }
59
60
       gsl vector free(start);
61
       gsl_vector_free(alpha);
62
       gsl_vector_free(beta);
63
       gsl_vector_free(tmp);
64
       gsl_vector_free(Vj);
65
       gsl_vector_free(Uj);
66
67
```