## Conjugate Gradient Method

Your work should be presented in the form of a typed report using clear and properly punctuated English. Where appropriate include full program listings and output. If you choose to work in a group of two, please turn in independently prepared reports.

1. The $n \times n$ Hilbert matrix $H$ is defined as the matrix with entries

$$
h_{i j}=\frac{1}{i+j-1} \quad \text { where } \quad i, j=1,2, \ldots, n .
$$

Prove for any $n \in \mathbf{N}$ that $H$ is symmetric and positive definite.
2. Let $w$ be a vector of length $n$ given by

$$
w_{i}=\frac{1}{3} \quad \text { where } \quad i=1,2, \ldots, n .
$$

Write a subroutine that computes $H w$ without storing the entire matrix $H$ into memory. Write a program to find $w \cdot H w$ for $n=10^{k}$ where $k=1,2,3,4$. The output from your program should look something like

| k | n | w. Hw |
| ---: | ---: | ---: |
| 1 | 10 | $1.486158673723173 \mathrm{e}+00$ |
| 2 | 100 | $1.534785401070720 \mathrm{e}+01$ |
| 3 | 1000 | $1.539771651244306 \mathrm{e}+02$ |
| 4 | 10000 | $1.540271513744324 \mathrm{e}+03$ |

3. Write a program that solves $H x=b$ by the conjugate gradient method. Test your program for $n=1000$ by choosing $b=H w$ where $w$ is the vector given above and $x=0$ as the initial guess for $x$. The output should look sometime like

| k | $\|\mathrm{w}-\mathrm{x}\|$ | $\|\mathrm{b}-\mathrm{Ax}\|$ |
| ---: | ---: | ---: |
| 0 | $1.054092553389460 \mathrm{e}+01$ | $1.698808462143129 \mathrm{e}+01$ |
| 1 | $5.489846287694768 \mathrm{e}+00$ | $4.406748857997090 \mathrm{e}+00$ |
| 2 | $3.456551995574104 \mathrm{e}+00$ | $1.170268545385278 \mathrm{e}+00$ |
| 3 | $2.122967238170827 \mathrm{e}+00$ | $2.607637508249531 \mathrm{e}-01$ |
| $\ldots$ | $\ldots$ | $\ldots$ |
| 50 | $3.406923944634312 \mathrm{e}-04$ | $1.256784027692001 \mathrm{e}-10$ |

4. What happens when one tries to use the conjugate gradient method to solve $A x=b$ when $A$ is not symmetric or positive definite?
5. Let $A$ be an invertible matrix. Prove $B=A^{T} A$ is symmetric and positive definite.
6. Consider the following method for solving $A x=b$ when $A$ is an arbitrary invertible matrix. Multiply both sides by $A^{T}$ to obtain

$$
B x=c \quad \text { where } \quad B=A^{T} A \quad \text { and } \quad c=A^{T} b .
$$

Then solve $B x=c$ using the conjugate gradient method. Test this method on some interesting matrices $A$ which are neither symmetric nor positive definite.

