

$$\text{re } \underline{A}\vec{x} = \vec{b}$$

Here take  $\underline{A}$  to be a real, symmetric,  $5 \times 5$  matrix.

1. Random matrix. When all 15 independent elements of  $\underline{A}$  are selected randomly from a Gaussian distribution with mean  $\langle a_{ij} \rangle = 0$  and dispersion  $\langle a_{ij}^2 \rangle = 1$ , four separate numerical experiments involving 50 such matrices apiece indicate that the calculated

$$\text{CN} \equiv \max|\lambda|/\min|\lambda|$$

seem to be distributed about so:

	Exp. #1	#2	#3	#4
largest	424	111	146	779
90% ile	70	37	23	30
75% ile	28	18	15	17
median	11	9	8	8
25% ile	6	6	5	4
10% ile	4	4	3	3
smallest	2.2	2.8	2.5	2.9

2. Loaded string. On that basis, the well-known matrix on the right, with eigenvalues 1, 2, 3, and  $2+\sqrt{3}$  — and therefore

$$\text{CN} = 13.93$$

— seems only mildly perverse.

$$\begin{bmatrix} 2 & -1 & 0 & 0 & 0 \\ -1 & 2 & -1 & 0 & 0 \\ 0 & -1 & 2 & -1 & 0 \\ 0 & 0 & -1 & 2 & -1 \\ 0 & 0 & 0 & -1 & 2 \end{bmatrix}$$

3. Loaded beam. Considerably more irritating, owing to such likely loss of accuracy upon inversion, is the matrix:

Its eigenvalues are 0.21207, 1.4689, 4.6790, 9.5311 and 14.109; its

$$\text{CN} = 66.53$$

$$\begin{bmatrix} 6 & -4 & 1 & 0 & 0 \\ -4 & 6 & -4 & 1 & 0 \\ 1 & -4 & 6 & -4 & 1 \\ 0 & 1 & -4 & 6 & -4 \\ 0 & 0 & 1 & -4 & 6 \end{bmatrix}$$

4. Loaded dice! Quite appalling in this sense is the Hilbert matrix, whose  $(i,j)$ -th element is defined as the reciprocal of the sum  $i+j-1$ . Its eigenvalues are

1.56705, 2.08534E-1, 1.14075E-2, 3.05898E-4, 3.28793E-6

and its condition number is

$$\text{CN} = 476607 (!)$$

Note: If we had instead been dealing with  $10 \times 10$  matrices, the various CN's would have emerged as

R: 19 (median)    S: 48.37    B: 633.3    and    H: a modest  $1.6 \times 10^{13}$ .

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What does all this portend in practice?

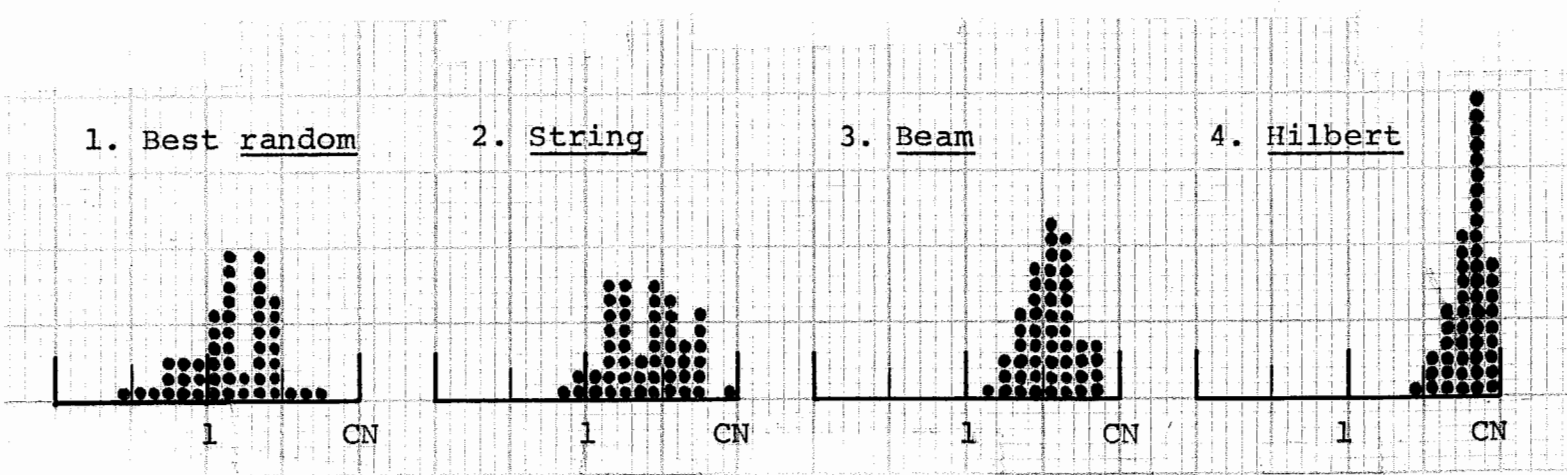
Obviously the "typical" relative error in the inferred  $\vec{x}$  is not going to be quite as bad as CN times the relative error in the given vector, or  $\delta\vec{b}$  — after all, the CN was invented by pessimists! But just how are the actual ratios

$$\mu = \frac{|\delta\vec{x}| |\vec{b}|}{|\vec{x}| |\delta\vec{b}|}$$

usually distributed within their conceivable range  $\frac{1}{\text{CN}} \leq \mu \leq \text{CN}$  ?

For this purpose, let us simply divide each such range into 20 logarithmically equal intervals or bins — e.g., ... 1/2 to 1, 1 to 2, 2 to 4, ... if  $\text{CN}=1024$ . Let us also produce, in their respective vector spaces, completely isotropic and random  $\vec{x}$  and  $\delta\vec{b}$ .

I have now conducted 50 such numerical experiments apiece for each of the four matrices above. (Here "random" was defined as that unusually lucky matrix whose  $\text{CN} =$  only 2.2.) The resulting histograms pretty much tell their own story: awful remains awful.



Median  $\mu$ : 1.13

3.0

10

40000