## The Francis Algorithm

Recall that we have a shifted QR iteration that converges quickly to a *reduced* Hessenberg matrix if the  $s_i$  are close to an eigenvalue of H (in fact, only one iteration does it if  $s_i$  is an eigenvalue of H (this is called an *ultimate shift*)). If H is reduced, we can decouple (or deflate) and continue with a strictly smaller problem than before. Here is the iteration:

$$\begin{array}{rcl} Q_i R_i &=& H_i - s_i I \\ H_{i+1} &=& R_i Q_i + s_i I &=& Q_i^t H_i Q_i \end{array}$$

Nonsymmetric real matrices may have complex eigenvalues, which must occur in conjugate pairs: u + iv and u - iv. If we apply a complex shift  $s_i = u + iv$  to the iteration, then  $Q_i$ ,  $R_i$  and  $H_{i+1}$  will be complex. This requires more storage, and more computation (one complex multiplication requires 4 real multiplications and 2 real additions).

Now if we immediately follow the  $s_i = u + iv$  shift iteration with an iteration with shift  $s_{i+1} = u - iv$ , then everything becomes again real. We can understand this by noting that two iterations above gives the same  $H_{i+2}$  as the single iteration

$$QR = (H_i - s_i I)(H_i - s_{i+1}I)$$
  
$$H_{i+2} = Q^t H_i Q.$$

Even more:  $R = R_{i+1}R_i$  and  $Q = Q_iQ_{i+1}$ . So here is a way to apply two complex conjugate shifts in succession using only real arithmetic! While it appears, that we have bought this efficiency at the cost of forming  $G = (H_i - s_iI)(H_i - s_{i+1}I)$ , a wonderful uniqueness result comes to our aid:

The Implicit Q Theorem says that if  $H_{i+2} = Q^t H_i Q$  is unreduced, then it is essentially uniquely determined by  $H_i$  and the first column of Q.

Thus we need only compute enough of G to determine the first column of Q, the remainder of Q is discovered through a Hessenberg reduction. Here are the details:

$$QRe_1 = Ge_1 \implies Qe_1 = \pm Ge_1/\|G\|_2$$

So define a Householder reflector,  $P_0$ , so that  $P_0Ge_1 = \alpha e_1$  (the first step of the Householder QR factorization of G), and apply this *not* to G, but to  $H_i$  as a similarity transform:  $B = P_0H_iP_0$ . B is no longer Hessenberg, it has a bulge at  $b_{41} \neq 0$ , so we need reflectors  $P_1, P_2, \ldots, P_{n-2}$  to "chase the bulge" from  $b_{41}$  to  $b_{52}$  to  $\ldots$  to  $b_{n,n-2}$ , resp. to "re-Hessenbergize"  $H_i$ :

$$H_{i+2} = P_{n-2} \cdots P_1 P_0 H_i P_0 P_1 \cdots P_{n-2} = Q^t H_i Q.$$

All of this was developed in J. Francis' 1961 paper, along with a scheme for choosing the shifts  $s_i$  and  $s_{i+1}$  as the eigenvalues of the lower right  $2 \times 2$  submatrix of  $H_i$ . While fallable, this method – augmented with schemes for detecting subdiagonal elements "small enough" to allow decoupling and deflation – is the state of the art general purpose eigenvalue method.