## Notes of a Numerical Analyst

# Hermite polynomial surprises

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Among the oldest tools in the box are Hermite polynomials, which are used for working with functions of a real variable that decay as  $|x| \rightarrow \infty$ . Hermite polynomial expansions and numerical methods are derived from conditions of optimality. Yet they are far — very far! — from optimal.

We can illustrate the issue by looking at a problem of quadrature. Suppose a function f is given and we want to calculate the integral

$$I = \int_{-\infty}^{\infty} f(x)e^{-x^2}dx. \tag{1}$$

A quadrature formula is an approximation

$$I_n = \sum_{k=1}^n w_k f(x_k) \tag{2}$$

for some nodes  $x_1,\ldots,x_n$  and weights  $w_1,\ldots,w_n$ . Suppose we ask, what  $\{x_k\}$  and  $\{w_k\}$  are optimal in the sense that (2) gives exactly the correct answer,  $I=I_n$ , whenever f is a polynomial of the highest possible degree? There is a unique such choice, and it is called *Gauss-Hermite quadrature* (*GH*), integrating (1) exactly whenever f is a polynomial of degree  $\leq 2n-1$ .

For example, for  $f(x)=e^x$ , the integral is  $I=e^{1/4}\pi^{1/2}\approx 2.275875794469$ . With just n=9, GH gives the approximation  $I_n\approx 2.275875794454$ , accurate to better than  $10^{-10}$ .

But the story changes for a more complicated function like  $f(x) = \cos(x^3)$ . To get  $|I - I_n| < 10^{-10}$  with GH now, we need  $n \ge 606$ . Yet this integral is not really as hard as that, for although  $\cos(x^3)$  wiggles a lot, the factor  $\exp(-x^2)$  damps it down. In fact, if we chop the interval to [-5,5] and apply ordinary Gauss(–Legendre) quadrature,  $n \ge 89$  is enough to give ten digits.

Figure 1 shows this effect for varying n. The nodes of GH span a range of order  $\exp(Cn^{1/2})$ . This is so wide that if f is a bounded analytic function on the real line, the outer samples contribute negligibly to (2), and the accuracy is only  $O(\exp(-Cn^{1/2}))$ . (With n=606, 476 of the weights are below the

standard machine precision of  $\approx 10^{-16}$ !) By contrast if we apply Gauss–Legendre quadrature on a narrower interval of size  $\exp(Cn^{1/3})$ , the accuracy improves to  $O(\exp(-Cn^{2/3}))$ .

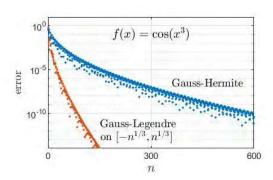


Figure 1. Gauss-Hermite quadrature, notwithstanding its optimality, converges far more slowly than chopping the real axis to a finite interval and applying a simpler formula.

How can an optimal formula be so far from optimal? The explanation is that polynomial exactness implies very little about accuracy. Polynomials must grow as  $|x| \to \infty$ , and loosely speaking, a formula that treats them exactly wastes most of its effort managing that growth.

We mathematicians have a way of proving theorems that are literally true, yet miss the point — I call them "inverse Yogiisms". GH is 140 years old, but although many theorems have been published, its optimality has rarely been questioned.

#### **FURTHER READING**

[1] L. N. Trefethen, Inverse Yogiisms, *Notices of the AMS*, December 2016.

[2] L. N. Trefethen, Exactness of quadrature formulas, *SIAM Review*, to appear.



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