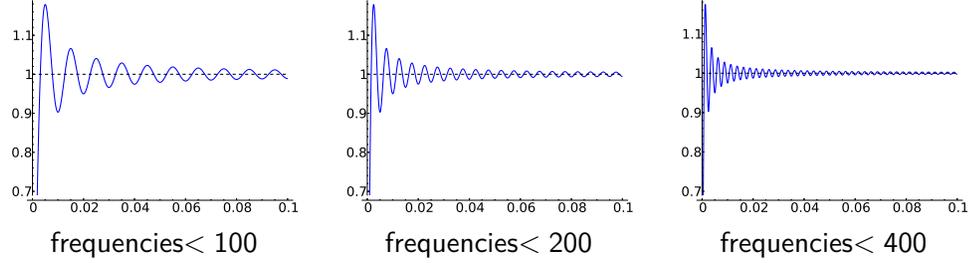




of the truncated Fourier series for  $x$  in the left part of  $(0, 1/2)$  terminates our hope. The convergence is lame, the series overshoots wildly the function and it is not approximately confined to the gap between the branches at both sides of the singularity. The Fourier series and the function are odd, so the behavior to the left is exactly symmetric.



When we take frequencies less than  $\delta^{-1}$  it seems that the interval  $[0, \delta]$  contains a lump of size like 0.2 independently of how small is  $\delta$ . Let us write and prove it as a mathematical result.

**Proposition 1.2.11.** *For  $f$  as before, we have*

$$\lim_{N \rightarrow \infty} \sup_{|x| < 1/(2N+1)} |f(x) - S_N f(x)| = \int_{-1}^1 \frac{\sin(\pi x)}{\pi x} dx - 1 = 0.17897974 \dots$$

There is nothing special about  $\text{sgn}(x)$ . Think for instance that for  $g: \mathbb{R} \rightarrow \mathbb{C}$  regular,  $g(x) + \sum_{j=1}^J \lambda_j \text{sgn}(x - \mu_j)$  is the generic form of a regular real variable function except for a finite set of jump discontinuities. In the case of  $\text{sgn}(x)$  we have a lump of size 0.17... for a jump of size 2. Scaling these values, in general the lumps are always like a 9% of the jump, this is called *Gibbs phenomenon*.

*Proof.* By the symmetry, we only consider the case  $x \geq 0$ . For any  $f$  we know that  $S_N f = D_N * f$  and in our case we have

$$S_N f(x) = - \int_x^{x+1/2} D_N(t) dt + \int_{x-1/2}^x D_N(t) dt.$$

Substituting the explicit formula for  $D_N$  and using its parity, this is

$$S_N f(x) = \int_{-x}^x \frac{\sin((2N+1)\pi t)}{\sin(\pi t)} dt - \int_{-x-1/2}^{x-1/2} \frac{\sin((2N+1)\pi t)}{\sin(\pi t)} dt.$$

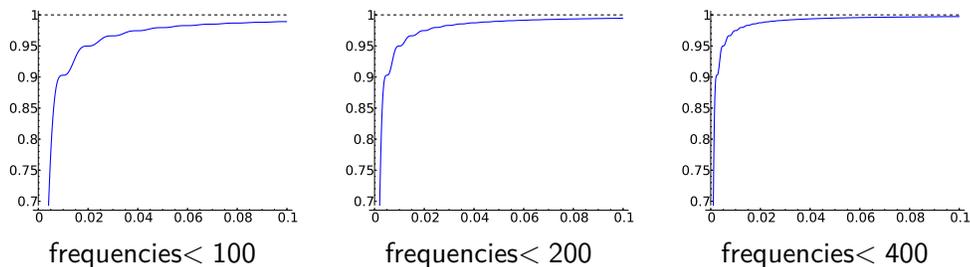
Integrating by parts (note that  $x$  is small), the second integral is  $O(N^{-1})$ .

Clearly the supremum of the first integral is reached for  $x = 1/(2N+1)$  because the function under the integral is positive. Finally,

$$\int_{-1/(2N+1)}^{1/(2N+1)} \frac{\sin((2N+1)\pi t)}{\sin(\pi t)} dt = \int_{-1}^1 \frac{\sin(\pi x)}{(2N+1) \sin(\pi x / (2N+1))} dx$$

is just a change of variables and the denominator tends to  $\pi x$ . □

It seems that Gibbs phenomenon is a serious drawback in the applicability of Fourier analysis for discontinuous signals but it is not the end of the world because there are localized versions of Fourier analysis (for instance the wavelets that we shall treat in a future chapter) and because we can reduce the effect of the singularities with a regularization (this is related to the filters that we shall consider in the digital setting in another future section). For instance, compare the following figures with the previous ones, the only difference is replacing  $S_N f$  by  $\tilde{S}_N f$  as in Theorem 1.2.5.



Although we still have large errors near zero (as it must be because we are approximating a discontinuous function), we do not see lumps, the general aspect is less shaky. This is important, think for instance in medical imaging. The big wobbles in the first case would transform in stains between sharp transitions, different tissues, that could be misinterpreted as a tumor while the second approach would give a blur smoother change between tissues.

**Suggested Readings.** Again Gibbs phenomenon belong to basic Fourier analysis and it is nicely explained in the monographs mentioned before, for instance [Kör88] and [DM72].

### 1.2.5 More flavors of harmonic analysis

Why cosine and sine? Because, as we have seen, basic electronic circuits lead to these functions. Another not technologically based reason is that for instance, the physiology of hearing introduces some filtering on the frequencies, then if we want to understand or to simulate hearing (yes, with technology!) it seems handy to read the content on each frequency through Fourier analysis<sup>6</sup>.

In other situations, it might be more convenient to analyze in terms of other non trigonometrical functions having special properties. The bundle of techniques and problems derived from the analytical decomposition of a function into something that we would call “pure tones” or even better “harmonics”, it is called *harmonic analysis*. What is really a harmonic? The honest answer is whatever you find convenient. Here we consider harmonic analysis somewhat related to symmetries to illustrate that there is something beyond the classic Fourier series and integrals.

Symmetry sounds to group theory, then we are going to consider mainly groups. Let us start with a finite abelian group  $G$ . The functions  $f : G \rightarrow \mathbb{C}$  that we want to analyze

<sup>6</sup>In [MK11, §4.1] we read “*Fourier analysis is like a glass prism, which splits a beam of light into frequency components corresponding to colors*”.