William Hart

04-July-2010

William Hart The Discrete Fourier Transform

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m s}} \, \, {
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Can recover f from the Fourier Inversion Formula

$$f(x) = \int_{-\infty}^{\infty} e^{2\pi \operatorname{ixs}} \hat{f}(s) \, \mathrm{ds}$$

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Restrict to locally compact, Hausdorff topological groups

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Some standard examples:

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- Adele ring with the usual restricted topology

Haar Measure

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- For the discrete examples, Haar measure is the counting measure
- For other (non-adele) examples can construct Haar measure from Lebesgue measure

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- $\hat{f}: \hat{G} \to \mathbb{C}$ where \hat{G} is the Pontryagin dual of G
- \hat{G} is space of additive characters of G (continuous additive homomorphisms) $s: G \to \mathbb{R}/\mathbb{Z}$

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► The Discrete Fourier Transform

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DFT of f = a₀ + a₁x + ··· + a_{n−1}x^{n−1} at ζ_j is

$$\hat{f}_j = \hat{f}(\zeta_j) = \sum_{m=0}^{n-1} a_n e^{-2\pi \operatorname{ijm}/n}.$$

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- Fourier inversion theorem (conditions)

$$(\#G)^{-1}\widehat{a}(-g) = a(g)$$
 for $a \in K[G]$.

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(Fermat Ring) R = Z/pZ for p = 2^{a2^K} + 1 (not necessarily prime), a, K ∈ N. 2^a is a primitive 2^{K+1}-th root of unity in R.

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$$\blacktriangleright S = \mathbb{Z}[x]/(x^{2^n}+1)$$

• (non-example) Mersenne Ring $R = \mathbb{Z}/p\mathbb{Z}$ for $p = 2^{2^{\kappa}} - 1$

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• Retrieve convolution of f, g using inverse Fourier transform

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$$G = \mathbb{Z}/n\mathbb{Z}$$
, for $f = a_0 + a_1x + \dots + a_{n-1}x^{n-1}$ and $g = b_0 + b_1x + \dots + b_{n-1}x^{n-1} \in \mathbb{C}[x]/(x^n - 1)$, have

$$(f \star g)_j = \sum_{m=0}^{n-1} a_m b_{j-m \pmod{n}}$$

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► Here convolution is multiplication of polynomials modulo xⁿ - 1.

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- ▶ For $\mathbb{Z}/2^n\mathbb{Z}$ get Cooley-Tukey FFT, complexity $O(n \log n)$

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- Sum is cyclic convolution of two length p-1 vectors
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- ► Cost somewhere between O(n²) and O(n log n) for recursive Rader FFT

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- ► If f is a C-valued fn. on a finite group G then a Fourier transform of f is a set of matrix sums

$$\hat{f}(
ho) = \sum_{g \in G} f(g)
ho(g),$$

one for each ρ in a complete set \mathcal{R} of inequiv. irred. reps.

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Wedderburn's isomorphism

One can also use Wedderburn's Theorem for the group algebra $\mathbb{C}[G].$

Fourier transform is an isomorphism

$$B = \oplus_{m=1}^{r} B_m : \mathbb{C}[G] \to \oplus_{m=1}^{r} \mathbb{C}^{b_m \times b_m}$$

to algebra of block diagonal matrices, with r the number of classes of inequiv. irred. reps. of $\mathbb{C}[G]$

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• Fourier inversion formula, for \mathcal{R} is

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- Set R of reps. of G is H-adapted if when restricted to H they can be constructed as direct products of fixed set of inequiv. irred. reps. of H

► Fast Fourier Transform G = Z/2ⁿZ, used in fast polynomial and large integer multiplication

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• $G(a; p) = \left(\frac{a}{p}\right) i^{(p-1)/2} \sqrt{p}$, so Legendre symbol is essentially its own DFT

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- What does Sage implement in the way of DFTs for abelian LCAs?
- What does Sage implement in the way of DFTs for nonabelian LCHTGs?

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