

## Exercise Problems 9–12: Information Theory

### Exercise 9

$Y$  and  $Z$  are two continuous random variables.

$Y$  has an exponential probability density distribution  $p(x)$  over  $x \in [0, \infty)$ :  $p(x) = e^{-x}$ .

Note that

$$\int_0^{\infty} e^{-x} dx = [-e^{-x}]_0^{\infty} = 1.$$

$Z$  has a uniform probability density distribution:  $p(x) = 1/\alpha$  for  $x \in [0, \alpha]$ , else  $p(x) = 0$ .

Calculate the differential entropies  $h(Y)$  and  $h(Z)$  for these two continuous random variables, and find the value of  $\alpha$  for which these differential entropies are the same. Sketch these distributions.

### Exercise 10

(a) What does it mean for a function to be “self-Fourier?” Name three functions which are of importance in information theory and that have the self-Fourier property, and in each case mention a topic or a theorem exploiting it.

(b) Show that the set of all Gabor wavelets is closed under convolution, *i.e.* that the convolution of any two Gabor wavelets is just another Gabor wavelet. [HINT: This property relates to the fact that these wavelets are also closed under multiplication, and that they are also self-Fourier. You may address this question for just 1D wavelets if you wish.]

(c) Show that the family of sinc functions used in the Nyquist Sampling Theorem,

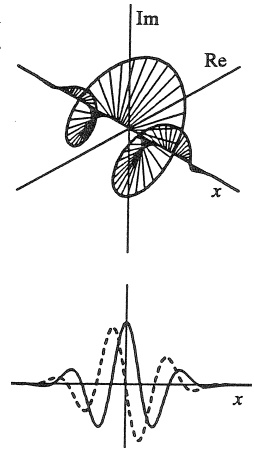
$$\text{sinc}(x) = \frac{\sin(\lambda x)}{\lambda x}$$

is closed under convolution. Show further that when two different sinc functions are convolved, the result is simply whichever one of them had the lower frequency, *i.e.* the smaller  $\lambda$ .

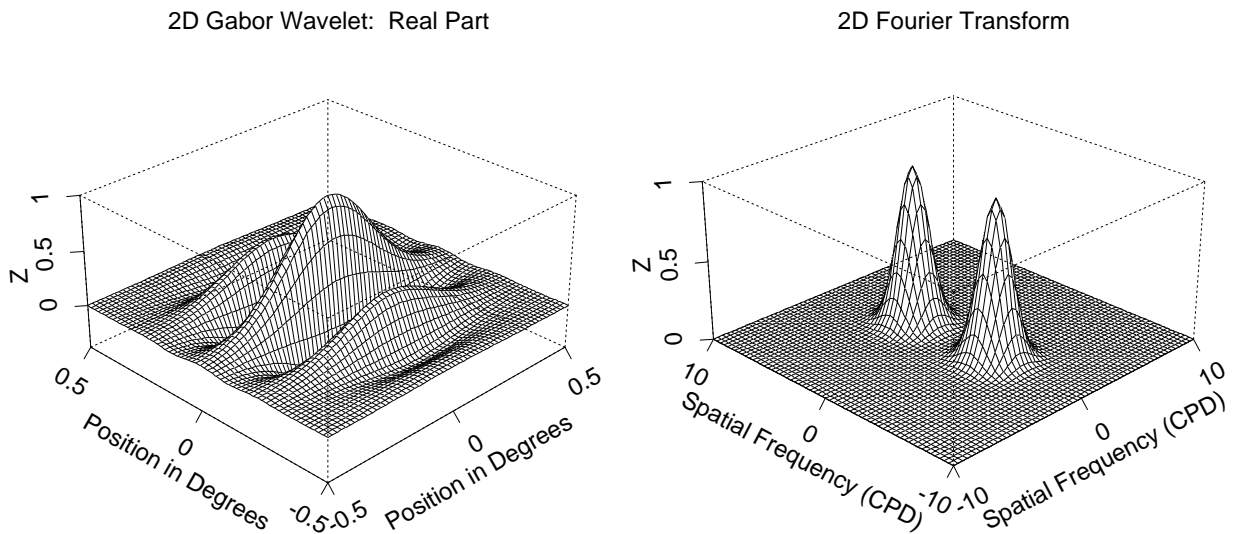
### Exercise 11

(a) An important class of complex-valued functions for encoding information with maximal resolution simultaneously in the frequency domain and the signal domain are Gabor wavelets. Using an expression for their functional form, explain:

1. their spiral helical trajectory as phasors, shown here with projections of their real and imaginary parts;
2. the Uncertainty Principle under which they are optimal;
3. the spaces they occupy in the Information Diagram;
4. some of their uses in pattern encoding and recognition.



(b) Explain why the real-part of a 2D Gabor wavelet has a 2D Fourier transform with two peaks, not just one, as shown in the right panel of the Figure below.



## **Exercise 12**

- (a) Compare and contrast the compression strategies deployed in the JPEG and JPEG-2000 protocols. Include these topics: the underlying transforms used; their computational efficiency and ease of implementation; artefacts introduced in lossy mode; typical compression factors; and their relative performance when used to achieve severe compression rates.
- (b) Define the Kolmogorov algorithmic complexity  $K$  of a string of data, and say whether or not it is computable. What relationship is to be expected between the Kolmogorov complexity  $K$  and the Shannon entropy  $H$  for a given set of data? Give a reasonable estimate of  $K$  for a fractal, and explain why it is reasonable. Discuss the following concepts in Kolmogorov's theory of pattern complexity: how writing a program that generates a pattern is a way of compressing it, and executing such a program decompresses it; Kolmogorov incompressibility, and patterns that are their own shortest possible description.