

# 1 Python correction

## 1.1 White noise

The white noise is generated with the following code.



```
1 %% white noise simulation
  W = np.random.randn (N, N) ;
```

## 1.2 Gaussian Random Field

The Gaussian function that will serve as a covariance function is generated via the given code. Pay attention to the discretization grid: the FFT implies that functions are periodic, and in order to do that, the discretization must be set between  $[-N/2 : N/2[$ .

The Gaussian Random Field can be generated via the formula already presented (see Fig.1).



```
def grf2D(N, sigma):
2   # Discrete space
   x = np.arange(-N/2 , N/2) ;
4   [ X , Y ] = np.meshgrid( x , x ) ;

6   # Covariance function
   C = np.exp(-1/2 * ( (X/ sigma /np.sqrt(2))**2+(Y/sigma/np.sqrt(2) )**
       ↪ 2 ) ) ;
8   Cmat = np.fft.fftshift (C) ;

10

   # real positive part, then square root
12   Cf = np.real(np.fft.fft2( Cmat ) ) ;
   Cf = np.sqrt ( np.maximum ( np.zeros ( Cf.shape ) , Cf ) ) ;
14   # Complex white noise
   W = np.random.randn (N, N) ;

16

   A = Cf * np.fft.fft2(W);
18   G = np.real ( np.fft.ifft2 (A) ) ;
   return G;
```

## 1.3 Minkowski functionals

The Minkowski functionals are illustrated in Fig.2. The code follows.

The measures can be performed with the code from the tutorial about integral geometry.

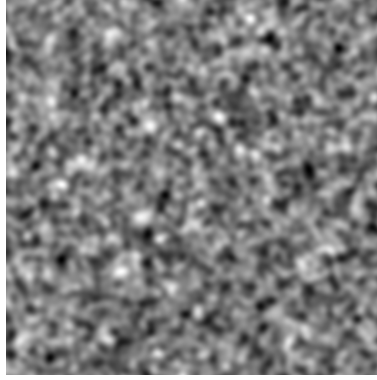
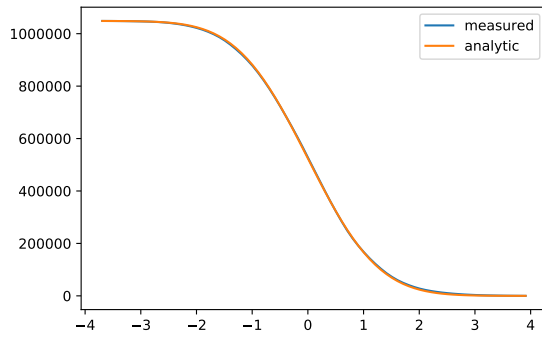
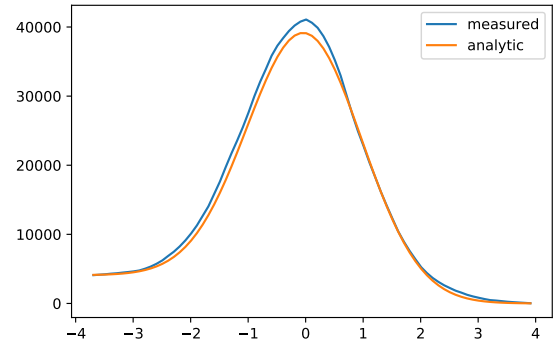


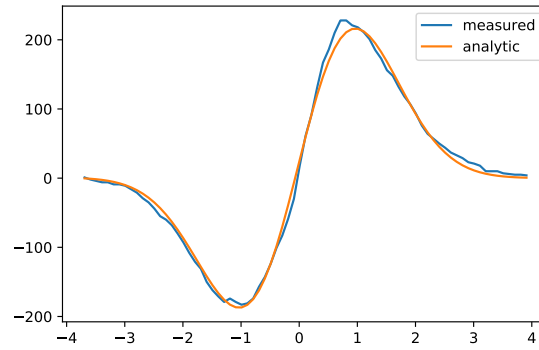
Figure 1: Gaussian Random Field, with  $\sigma = 10$  (pixels) and  $N = 2^{10} = 1024$  pixels.



(a) Area.



(b) Perimeter.



(c) Euler number in 4 connectivity.

Figure 2: Illustration of the simulated and analytical values of the Minkowski functionals of the level sets of the Gaussian Random Field, for  $\sigma = 10$  and  $N = 1024$ .



```

1 def bwminko(X):
    # zero padding of input
3     X = np.pad(X, ((1,1), (1,1)), mode='constant');
    # Neighborhood configuration
5     F = np.array([[0, 0, 0], [0, 1, 4], [0, 2, 8]]);
    XF = signal.convolve2d(X,F,mode='same');
7     edges = np.arange(0, 17,1);
    h,edges = np.histogram(XF[:], bins=edges);
9
    f_intra = [0,1,0,1,0,1,0,1,0,1,0,1,0,1,0,1];
11    e_intra = [0,2,1,2,1,2,2,2,0,2,1,2,1,2,2,2];
    v_intra = [0,1,1,1,1,1,1,1,1,1,1,1,1,1,1,1];
13    f_inter = [0,0,0,0,0,0,0,0,0,0,0,0,0,0,0,1];
    e_inter = [0,0,0,1,0,1,0,2,0,0,0,1,0,1,0,2];
15    v_inter = [0,1,0,1,0,1,0,1,0,1,0,1,0,1,0,1];
    EulerNb4 = np.sum(h*v_inter - h*e_inter + h*f_inter)
17    Area = np.sum(h*f_intra)
    Perimeter = np.sum(-4*h*f_intra + 2*h*e_intra)
19    return Area, Perimeter, EulerNb4;

```

Then, the measurements consists in taking all the level-sets and evaluating the properties from these binary sets. Notice that the perimeter is allways a difficult task and is not really precise.



```

1 def minkoMeasured(G, sigma, hmin, hmax):
    H = np.arange(hmin, hmax, .1);
3     A = [];
    P = [];
5     E = [];

7     bar = progressbar.ProgressBar();
    for h in bar(H):
9         levelset = G >= h;
        a, p, e = bwminko(levelset);
11        A.append(a);
        P.append(p);
13        E.append(e);
    return A, P, E;

```

The analytical values are simply evaluated with the formulas.



```
def minkoAnalytical(N, sigma, hmin, hmax):  
2     l = 1/(2*sigma**2);  
    # analytical values  
4     H = np.arange(hmin, hmax, .1);  
     rho_0 = 1/2 * erfc(H / np.sqrt(2));  
6     rho_1 = np.sqrt(l) * np.exp(- H**2 / 2) / (2*np.pi);  
     rho_2 = 1 / (2*np.pi)**(3/2) * np.exp(- H**2 / 2) * H;  
8  
     Aa = N**2 * rho_0;  
10    Pa = 4*N*rho_0 + np.pi*N**2*rho_1;  
     Ea = rho_0 + 2*N*rho_1 + N**2*rho_2;  
12    return Aa, Pa, Ea;
```