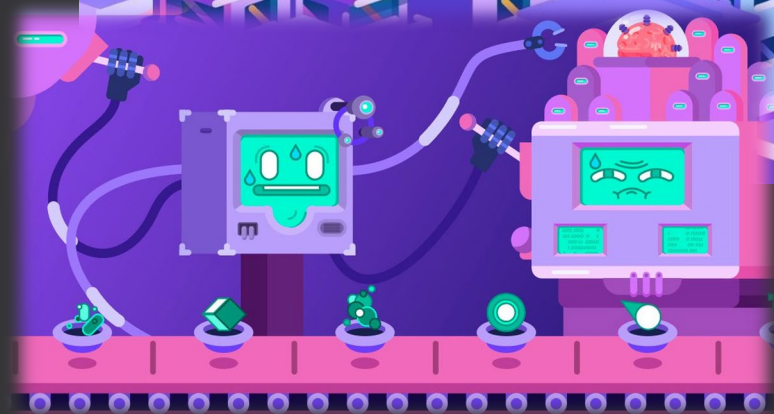




# Metody i narzędzia *Big Data*

*Obliczenia w małej i dużej skali -  
elementarzyk*



# Średnia i wariancja na bieżąco – przyrostowo, dla całego sygnału

Algorytmy do liczenia średniej i wariancji „w locie” mają ogólną postać

$$m_N = \Psi(m_{N-1}, x_N)$$

$$v_N = \Phi(v_{N-1}, m_N, x_N)$$

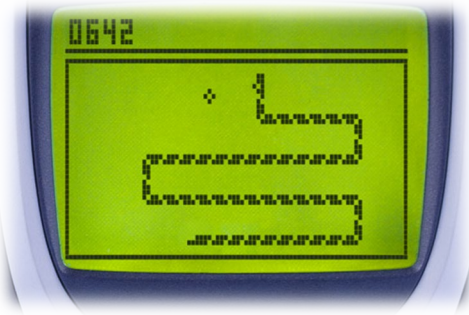
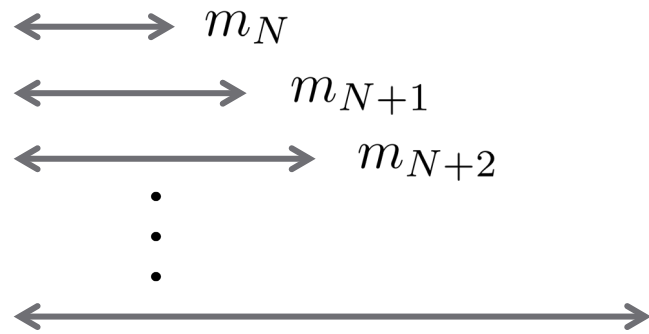
A konkretnie

$$m_N = \frac{N-1}{N}m_{N-1} + \frac{1}{N}x_N$$

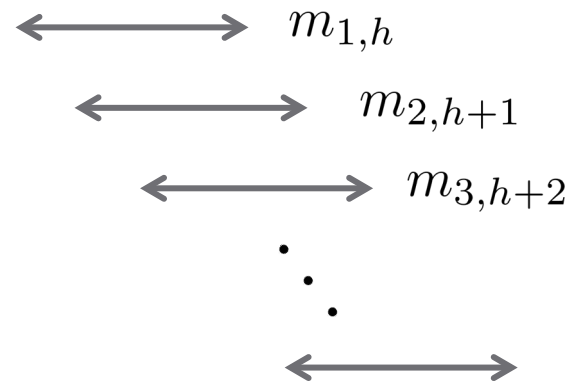
$$v_N = \frac{N-1}{N}v_{N-1} + \frac{1}{N-1}(m_N - x_N)^2$$

# Przyrostowo vs okno przesuwne

Przyrostowo



Okno przesuwne



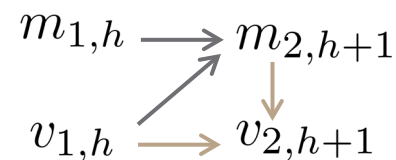
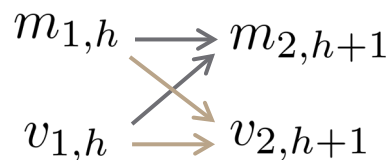
# Średnia i wariancja na bieżąco – na oknie przesuwnym



Algorytmy do liczenia średniej i wariancji „w locie” mają ogólną postać

$$m_{2,h+1} = \Psi(m_{1,h}, x_{h+1}, x_1)$$

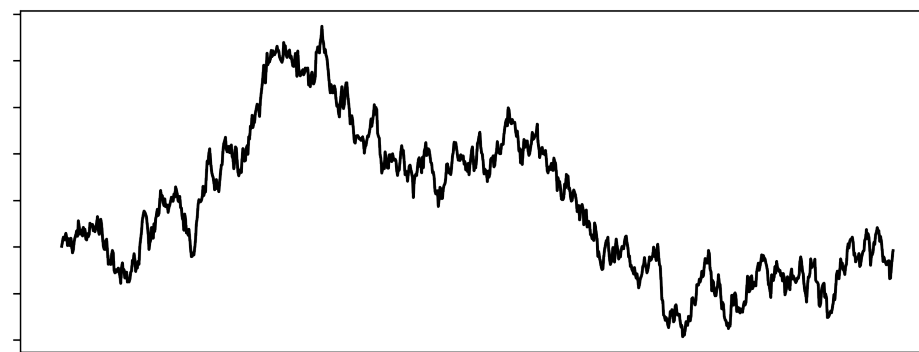
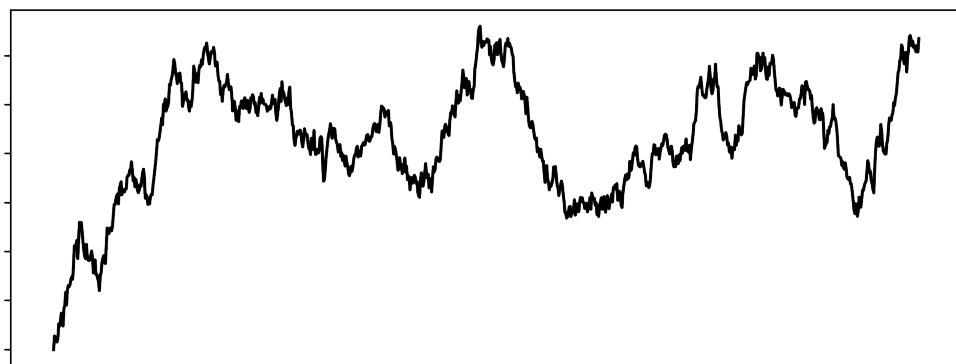
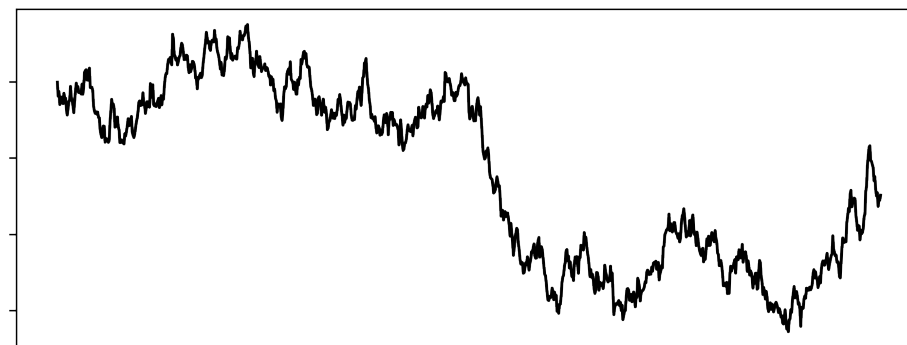
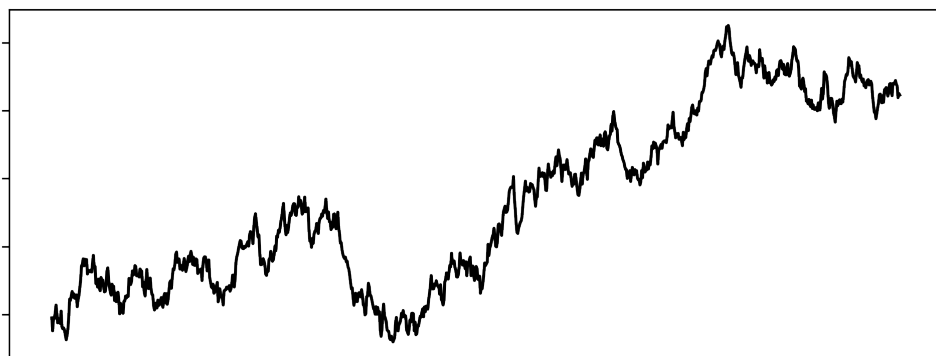
$$v_{2,h+1} = \Phi(v_{1,h}, m_{1,h}, x_{h+1}, x_1) \quad \text{lub} \quad v_{2,h+1} = \Phi(v_{1,h}, m_{2,h+1}, x_{h+1}, x_1)$$



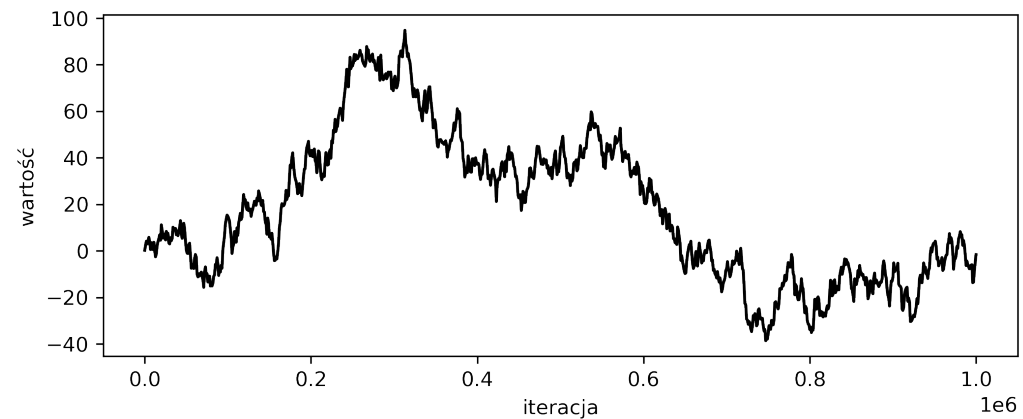
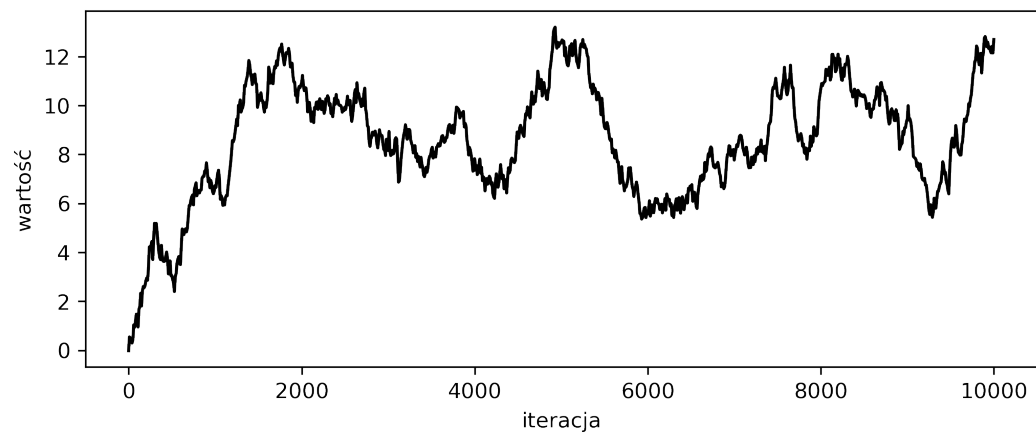
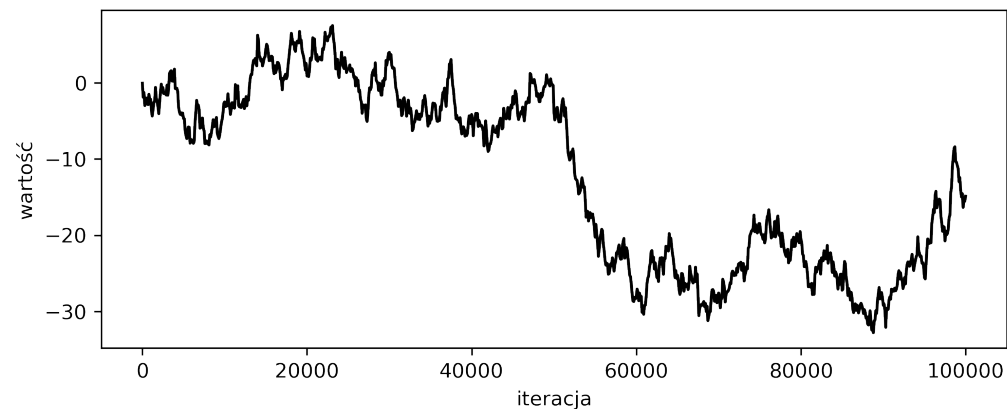
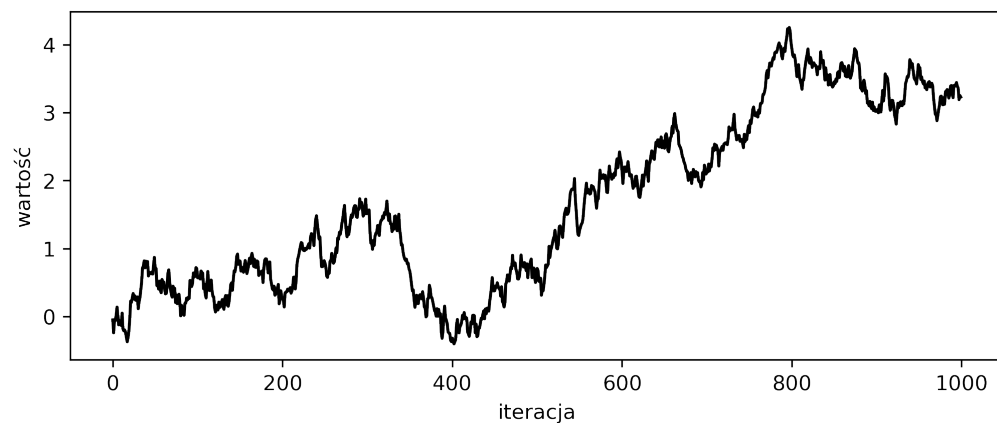
A konkretnie

$$m_{2,h+1} = m_{1,h} + \frac{1}{h}(x_{h+1} - x_1)$$

$$v_{2,h+1} = v_{1,h} - \frac{1}{h-1}(m_{1,h} - x_1)^2 + \frac{1}{h-1} \left( m_{1,h} - \frac{1}{h}x_1 + \frac{1-h}{h}x_{h+1} \right)^2$$



# Skala procesu



# Wykładnik Hursta

$$\{x_i\}_{i=1}^N$$



$$X_N = \sum_{i=1}^N x_i$$



$$R/S(N) = \frac{\max_{1 \leq i \leq N} \left\{ X_i - \frac{i}{N} X_N \right\} - \min_{1 \leq i \leq N} \left\{ X_i - \frac{i}{N} X_N \right\}}{\sqrt{\frac{1}{N} \sum_{i=1}^N \left( x_i - \frac{1}{N} X_N \right)^2}}$$



$$R/S(N) \propto N^H$$

<https://pypi.org/project/nolds/>

<https://github.com/Mottl/hurst>

Stochastic Models That Separate Fractal Dimension and Hurst Effect, Tilmann Gneiting and Martin Schlather (2001)

Qian, B., & Rasheed, K. (2004). *Hurst exponent and financial market predictability*. Proceedings of the IASTED International Conference Cambridge, MA.

Graves, T., Gramacy, R., Watkins, N., & Franzke, C. (2017). *A brief history of long memory: Hurst, Mandelbrot and the road to ARFIMA*. Entropy, 19(9).

# Wykładnik Hursta

Inny sposób

$$y_i = \log x_i$$

$$V(\tau) \equiv \text{Var} \left( \left\{ y_{i+\tau} - y_i \right\}_{i=1}^{N-\tau} \right)$$

$$V(\tau) \propto \tau^{2H}$$



# Jak interpretować $H$ ?

