

# Graduate Texts in Mathematics

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**Analysis and  
Probability**

**Wavelets, Signals,  
Fractals**



Springer

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Glossary: <i>function, random variable, signal, state, sequence (incl. vector-valued), random walk, time-series, measurement, nested subspaces, refinement, multiresolution, scales of visual resolutions, operator, process, black box, observable (if selfadjoint), Fourier dual pair, generating function, time/frequency, P/Q, convolution, filter, smearing, decomposition (e.g., Fourier coefficients in a Fourier expansion), analysis, frequency components, integrate (e.g., inverse Fourier transform), reconstruct, synthesis, superposition, subspace, resolution, (signals in a) frequency band, Cuntz relations, perfect reconstruction from subbands, subband decomposition, inner product, correlation, transition probability, probability of transition from one state to another, <math>f_{\text{out}} = T f_{\text{in}}</math>, input/output, transformation of states, fractal, conditional expectation, martingale, data mining (A translation guide!)</i> .....	xvii
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