Symbol Table

Numbers in parentheses refer to chapters where the symbol is used as indicated.

$b, \mathbf{b}$	regression coefficient function(s) estimates
$c, \mathbf{c}$	basis expansion coefficient(s)
d	discriminant of a second-order system; eigenvalue for a first-order system
g	forcing function
$h, \mathbf{h}$	warping function(s)
i, j, k, ℓ	indices
I, J, K, m, n, N	dimensions of vectors or matrices
$s, \mathbf{s}$	value(s) on the domain of a function
$t, \mathbf{t}$	value(s) on the domain of a function
w, W	log derivative of monotone or warping function
$x, \mathbf{x}$	functional data observation(s)
$y, \mathbf{y}$	functional data observation
$z, \mathbf{z}$	covariate scalar or functional data observation(s)
α	rate constant in an exponent (3); an intercept (9); forcing function (11)
β, β	regression coefficient function (scalar or vector)
γ	rate constant in an exponent
δ	time shift (8, 10); statistical technique (10)
ε	error or residual
θ	latent ability value (1); parameter (11)
λ	smoothing parameter value
μ	mean function (9,10,1); eigenvalue (7)
ν	eigenvalue (7)
ξ	weight function (6); exponential basis function (11)
η	weight function (7)
π	trigonometric constant
ρ	correlation (4, 6); probe functional (6, 7)
σ, Σ	standard deviation, variance, covariance

ϕ, ϕ	basis function
ψ, ζ	basis function
Θ	matrix of basis function values
Φ	matrix of basis function values
Ψ	matrix of basis function values

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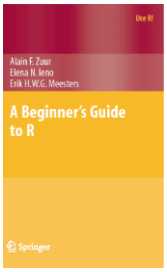

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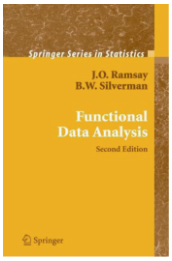

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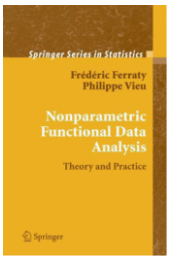

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