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1  function K = MTGP_covMaternisoU_shift(d, hyp, x, z, i)
2
3  % Matern covariance function with nu = d/2 and isotropic distance measure. For
4  % d=1 the function is also known as the exponential covariance function or the
5  % Ornstein-Uhlenbeck covariance in 1d.
6  %
7  % Based on the covMaternisoU.m function of the GPML Toolbox -
8  %   with the following changes:
9  %       - only elements of x(:,1:end-1)/z(:,1:end-1) will be analyzed,
10 %       - x(:,end)/z(:,end) will be ignored, as it contains only the label information
11 %       - independent of the label all x values will have the same hyp
12 %       - output scaling hyperparameter is fixed to 1
13 %       - function considers additional hyperparameter theta_s for features shift
14 %         (function is limited to 1D features)
15 %
16 % The covariance function is:
17 %
18 %    $k(x^p, x^q) = f(\sqrt{d} * r) * \exp(-\sqrt{d} * r)$ 
19 %
20 % with  $f(t)=1$  for  $d=1$ ,  $f(t)=1+t$  for  $d=3$  and  $f(t)=1+t+t^2/3$  for  $d=5$ .
21 % Here  $r$  is the distance  $\sqrt{((x-\theta_s)^p - (x-\theta_s)^q)' * \text{inv}(P) * ((x-\theta_s)^p - (x-\theta_s)^q)}$ ,  $P$  is ell times the unit matrix.
22 % The hyperparameters are:
23 %
24 %   hyp = [ log(ell) ]
25 %           theta_s(1)
26 %           ...
27 %           theta_s(nL-1)]
28 %
29 %
30 % by Robert Duerichen
31 % 04/02/2014
32
33 if nargin<3, K = 'nL'; return; end % report number of parameters
34 if nargin<4, z = []; end % make sure, z exists
35 xeqz = numel(z)==0; dg = strcmp(z,'diag') && numel(z)>0; % determine mode
36
37 nL = max(x(:,end));
38 ell = exp(hyp(1));
39 shift = (hyp(2:end));
40 if all(d~= [1,3,5]), error('only 1, 3 and 5 allowed for d'), end % degree
41
42 switch d
43     case 1, f = @(t) 1; df = @(t) 1;
44     case 3, f = @(t) 1 + t; df = @(t) t;
45     case 5, f = @(t) 1 + t.*(1+t/3); df = @(t) t.*(1+t)/3;
46 end
47 m = @(t,f) f(t).*exp(-t); dm = @(t,f) df(t).*exp(-t);
48
49 %% perform shift
50 for ii = 2:nL
51     x(x(:,end)== ii,1) = x(x(:,end)== ii,1)+shift(ii-1);
52     if ~isempty(z)
53         z(z(:,2)== ii,1) = z(z(:,2)== ii,1)+shift(ii-1);
54     end
55 end
56
57 % precompute distances
58 if dg % vector kxx
59     K = zeros(size(x(:,1:end-1)),1,1);
60 else
61     if xeqz % symmetric matrix Kxx
62         K = sqrt( sq_dist(sqrt(d)*x(:,1)'/ell) );
63     else % cross covariances Kxz
64         K = sqrt( sq_dist(sqrt(d)*x(:,1)'/ell,sqrt(d)*z(:,1)'/ell) );
65     end
66 end
67
68 if nargin<5 % covariances
69     K = m(K,f);
70 else % derivatives
71     if i==1

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72     K = K.*dm(K,f);
73 elseif i > 1 && i <= nL
74     dim = mod(i,2)+1;
75     ind_i = (x(:,2) ==i);
76     ind_ni = (x(:,2) ~=i);
77     B = zeros(length(x));
78     B(ind_ni,ind_i) = ones(sum(ind_ni),sum(ind_i));
79     B(ind_i,ind_ni) = -ones(sum(ind_i),sum(ind_ni));
80     A = repmat(x(:,dim) ,[1 length(x)]);
81     switch d
82     case 1
83         K = B.*exp(-K) ./ (ell) .*sign(A-A');
84     case 3
85         K = B.*sqrt(d) .*dm(K,f) ./ (ell) .*sign(A-A');
86     case 5
87         K = sqrt(d) .* (K.^2 +K) ./ (3*ell) .*exp(-K) .*B.*sign(A-A');
88
89     end
90 else
91     error('Unknown hyperparameter')
92 end
93 end

```