

## Day 2 Lab Part 2

ISI Short Course | June 1-3

### Exploring the implied covariance function in fixed rank Kriging

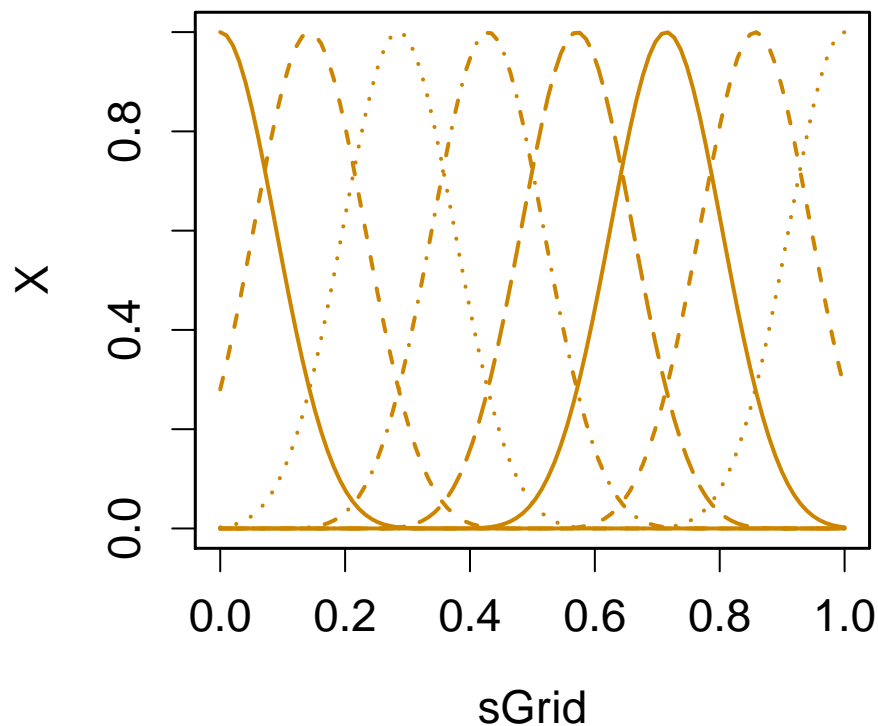
Recall  $\Omega$  is the covariance among the coefficients. Take this to be exponential in this example.

```
fields.style()
u<- seq( 0,1,length.out=8)
sGrid<- seq( 0,1,length.out= 100)

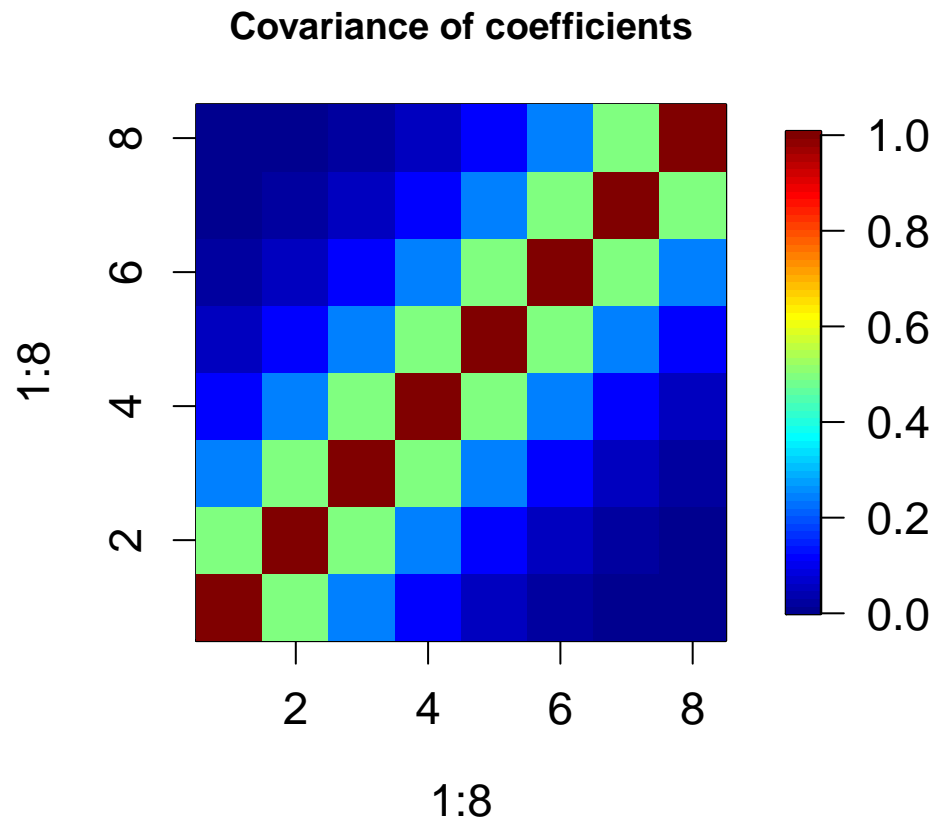
Omega<- Matern( rdist( u,u)/.2, smoothness=.5)
# smoothness .5 is also the negative exponential
X<- WendlandFunction( rdist( sGrid, u)/((3*1.0)/8))

matplot( sGrid, X, type="l", col="orange3", lwd=2)
title("Wendland basis functions")
```

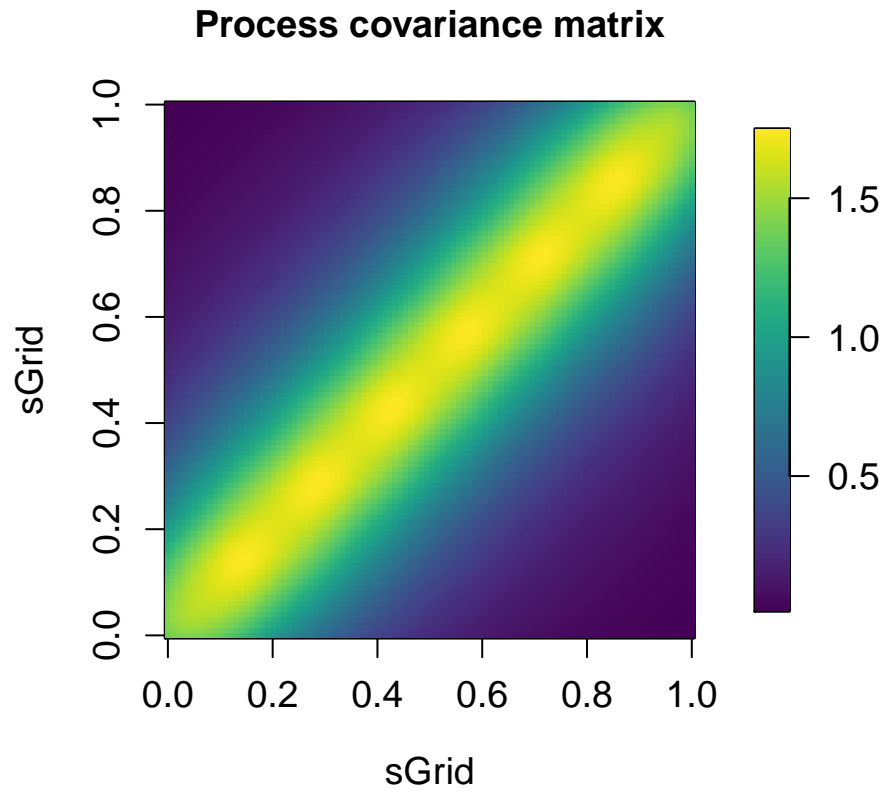
### Wendland basis functions



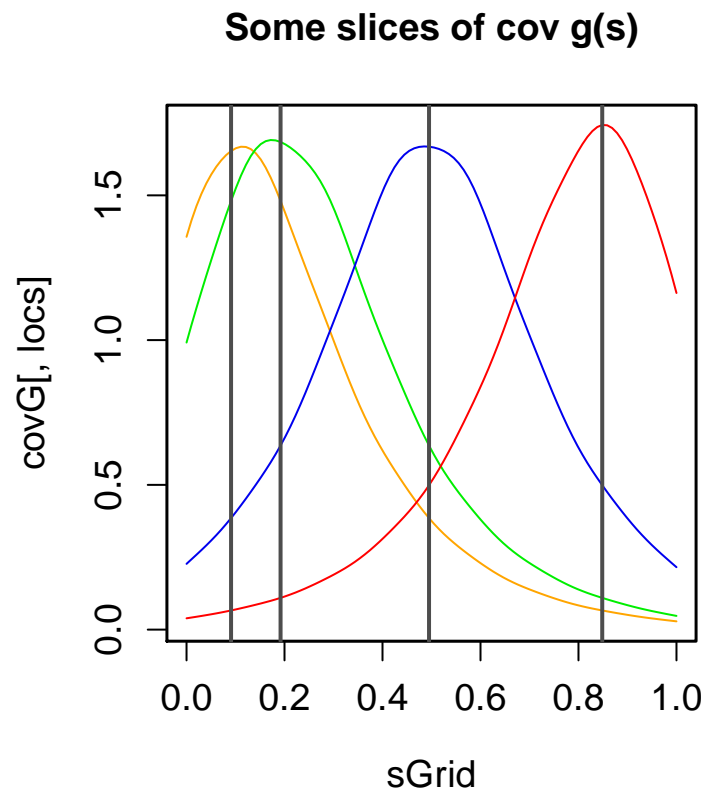
```
image.plot( 1:8,1:8, Omega)
title("Covariance of coefficients")
```



```
# covariance for the process
covG<- X%*%Omega%*%t(X)
image.plot(sGrid, sGrid, covG, col=viridis(256) )
title("Process covariance matrix")
```



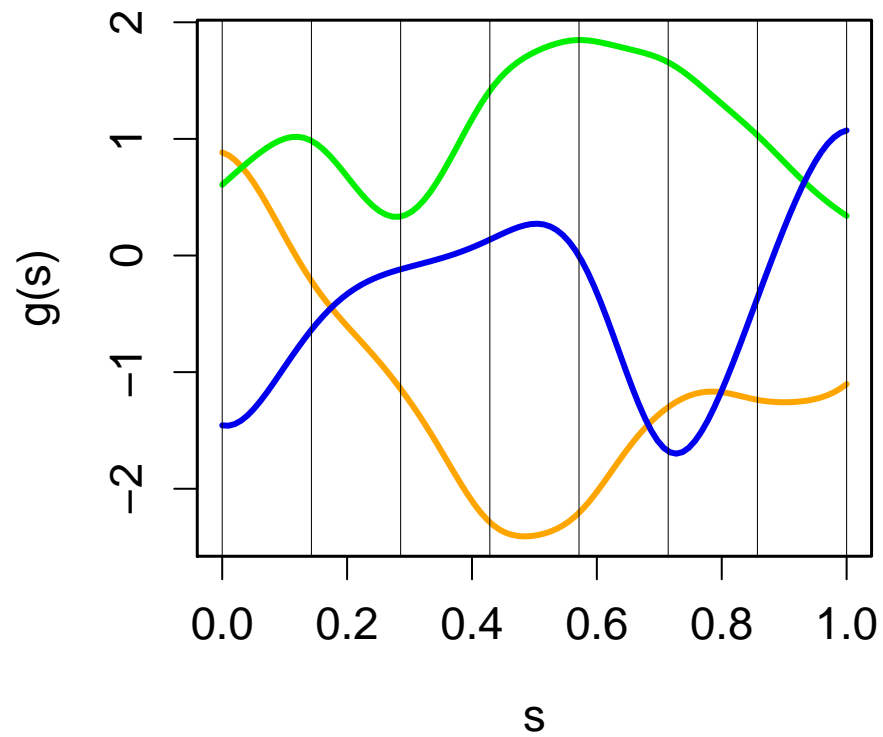
```
locs<- c( 10, 20, 50, 85)
matplot( sGrid, covG[,locs], type="l", lty=1)
xline( sGrid[locs], col="grey30", lwd=2)
title("Some slices of cov g(s)")
```



## Simulation of the FRK process

Simulating 3 realizations ( $\mathbf{M}$ ) of  $g$  from this model. Here for efficient vectorized coding  $\mathbf{gSim}$  is a matrix  $100 \times 3$  where each column is a realization.

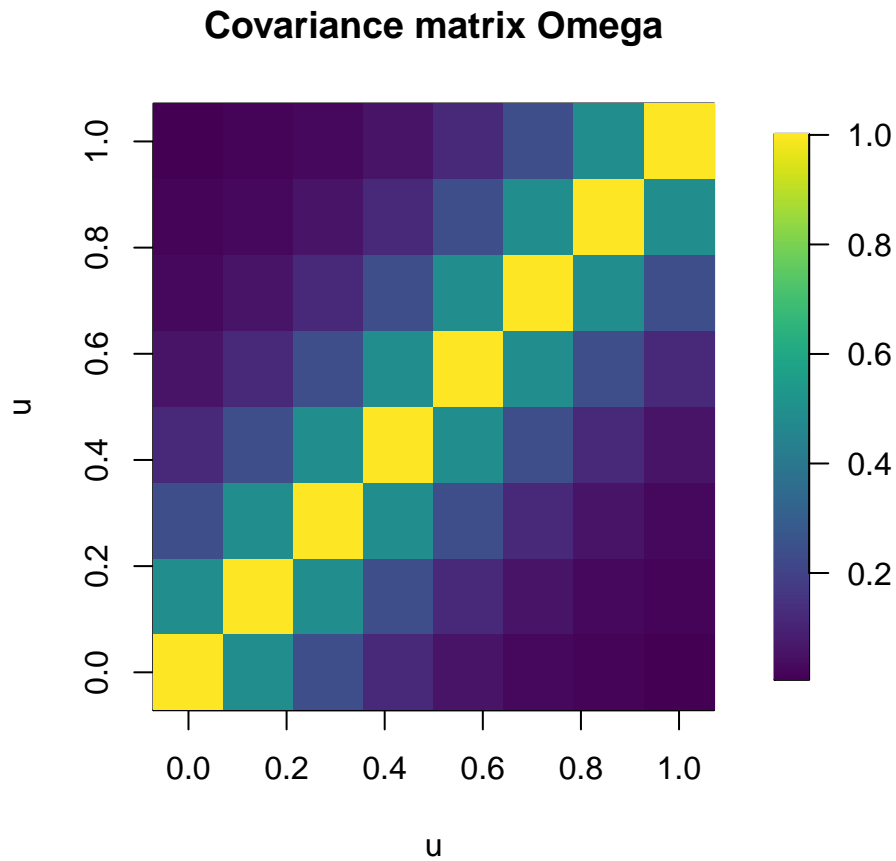
```
set.seed(2232)
B<- chol( Omega)
M<- 3
bigU<- matrix(rnorm( 8*M), 8,M )
c<- t(B)%*%bigU
gSim<- X%*%c
fields.style()
matplot( sGrid, gSim, type="l",
        lty=1, lwd=3, xlab="s", ylab= "g(s)")
# add knot locations for reference
xline( u, lwd=.5)
```



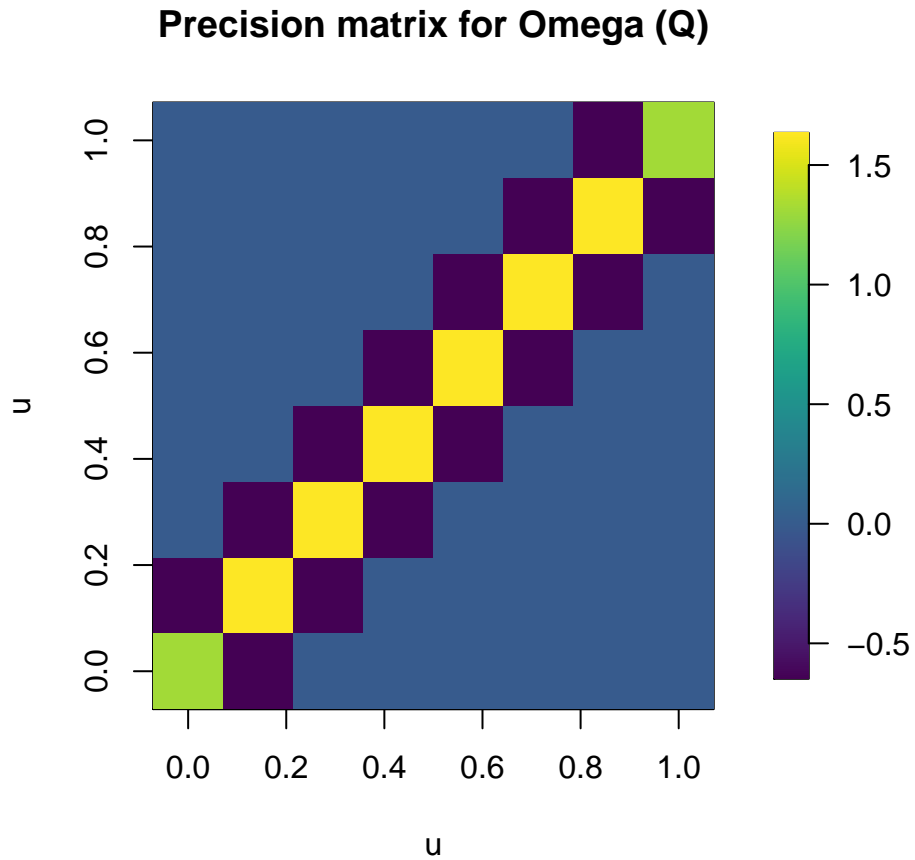
## Precision matrix for coefficients

Investigating the precision matrix for the coefficients. For this exponential there are many zeroes.

```
Q<- solve( Omega)
par( pty="s")
image.plot( u, u, Omega, col=viridis(256))
title("Covariance matrix Omega")
```



```
image.plot( u, u, Q, col=viridis(256))
title("Precision matrix for Omega (Q)")
```



## Exercises

1. How does the sparseness of the precision matrix ( $Q$ ) change when the smoothness is changed to 1.0 from .5?
2. Instead of 3 realizations generate 1000 ( change 3 to 1000) and find the maximum value of the process for each of these ( use the **apply** function across columns) Is the distribution of the maxima normally distributed?