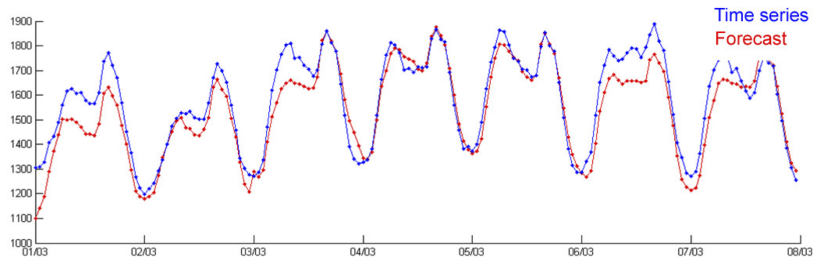
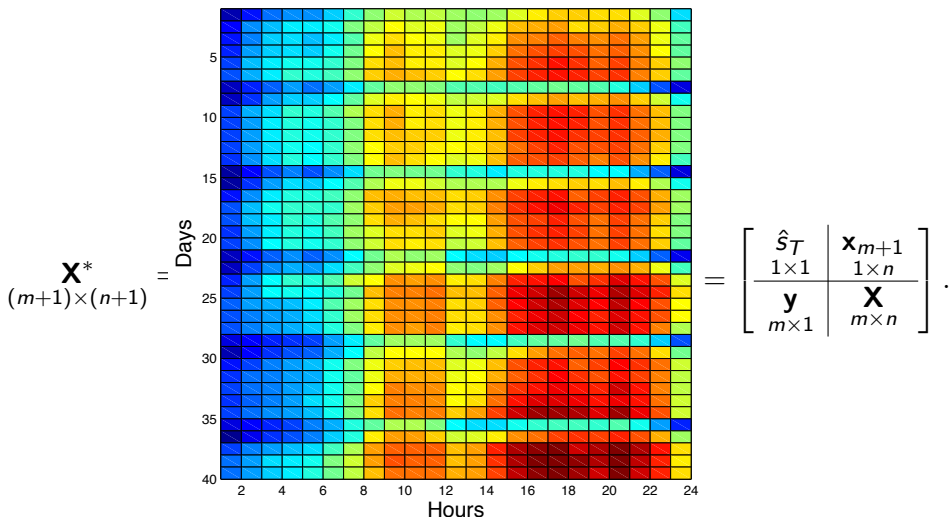


# Energy consumption one-week forecast for each hour



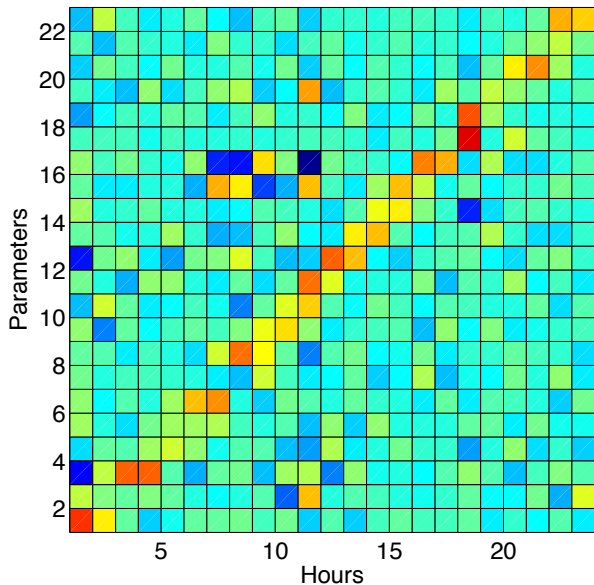
# The autoregressive matrix and the model



In terms of linear regression:

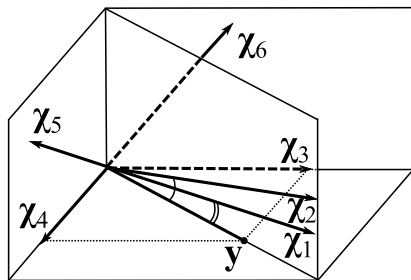
$$\hat{\mathbf{y}} = \mathbf{f}(\mathbf{X}, \mathbf{w}) = \mathbf{X}\mathbf{w}$$

## Case 6. How many parameters must be used? Relations of 24 hourly models



## Selection of a stable set of features of restricted size

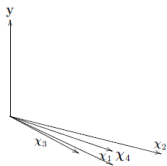
The sample contains multicollinear  $\chi_1, \chi_2$  and noisy  $\chi_5, \chi_6$  features, columns of the design matrix  $\mathbf{X}$ . We want to select two features from six.



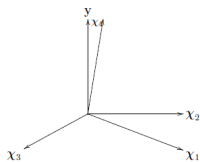
### Stability and accuracy for a fixed complexity

The solution:  $\chi_3, \chi_4$  is an orthogonal set of features minimizing the error function.

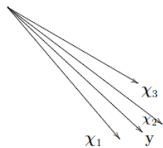
# Multicollinear features and the forecast: possible configurations



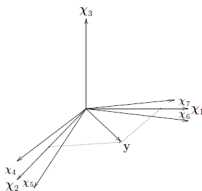
Inadequate and correlated



Adequate and random



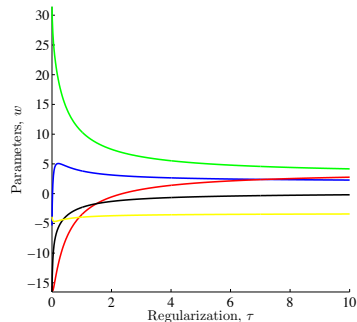
Adequate and redundant



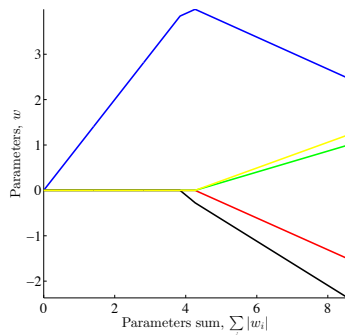
Adequate and correlated

# Model parameter values with regularization

Vector-function  $\mathbf{f} = \mathbf{f}(\mathbf{w}, \mathbf{X}) = [f(\mathbf{w}, \mathbf{x}_1), \dots, f(\mathbf{w}, \mathbf{x}_m)]^T \in \mathbb{Y}^m$ .



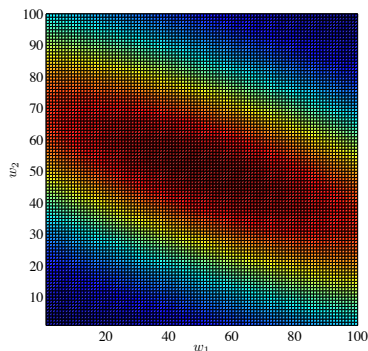
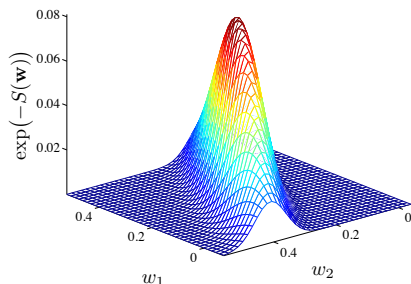
$$S(\mathbf{w}) = \|\mathbf{f}(\mathbf{w}, \mathbf{X}) - \mathbf{y}\|^2 + \gamma^2 \|\mathbf{w}\|^2$$



$$S(\mathbf{w}) = \|\mathbf{f}(\mathbf{w}, \mathbf{X}) - \mathbf{y}\|^2, \\ T(\mathbf{w}) \leq \tau$$

# Empirical distribution of model parameters

There given a sample  $\{\mathbf{w}_1, \dots, \mathbf{w}_K\}$  of realizations of the m.r.v.  $\mathbf{w}$  and an error function  $S(\mathbf{w}|\mathcal{D}, \mathbf{f})$ . Consider the set of points  $\{s_k = \exp(-S(\mathbf{w}_k|\mathcal{D}, \mathbf{f})) | k = 1, \dots, K\}$ .



x- and y-axis: parameters  $\mathbf{w}$ , z-axis:  $\exp(-S(\mathbf{w}))$ .