



## INTISARI

### Estimator Spline Dalam Regresi Nonparametrik dan Semiparametrik

Oleh

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Diberikan data  $(t_j, y_j)$  dan hubungan antara  $t_j$  dan  $y_j$  diasumsikan mengikuti model regresi nonparametrik :

$$y_j = f(t_j) + \varepsilon_j, j = 1, 2, \dots, n.$$

Bentuk kurva regresi  $f$  tidak diketahui dan diasumsikan licin (*smooth*), dalam arti  $f$  merupakan anggota ruang Sobolev  $W_2^m[0,1]$ . Sesatan random  $\varepsilon_j$  berdistribusi independen dengan mean nol dan variansi  $\sigma^2/w_j$ ,  $0 < w_j < \infty$ . Estimator  $f_\lambda$  diperoleh dengan meminimumkan *Penalized Least Square* Terbobot :

$$n^{-1} \sum_{j=1}^n w_j (y_j - f(t_j))^2 + \lambda \int_0^1 [f^{(m)}(t)]^2 dt.$$

Parameter penghalus  $\lambda$  merupakan kontrol antara *goodness of fit* dan *penalty*. Pendekatan *Reproducing Kernel Hilbert Space* memberikan estimator  $f_\lambda$  berupa polinomial spline natural terbobot berordo  $2m-1$ .

Diberikan data  $(t_j, x_j, y_j)$  dan hubungan antara  $t_j, x_j$  dan  $y_j$  diasumsikan mengikuti model regresi semiparametrik :

$$y_j = x_j' \gamma + f(t_j) + \varepsilon_j, j = 1, 2, \dots, n.$$

Variabel  $x_j' = (x_{j1}, \dots, x_{jp})$  dan  $t_j, j = 1, 2, \dots, n$  merupakan variabel-variabel prediktor. Vektor parameter  $\gamma = (\gamma_1, \dots, \gamma_p)' \in \mathbb{R}^p$  tidak diketahui dan  $f$  merupakan anggota ruang Sobolev  $W_2^m[0,1]$ . Sesatan random  $\varepsilon_j$  berdistribusi independen dengan mean nol dan variansi  $\sigma^2/w_j$ ,  $0 < w_j < \infty$ . Estimator  $\gamma_\lambda$  dan  $f_\lambda$  diperoleh dengan meminimumkan *Penalized Least Square* Terbobot :

$$n^{-1} \sum_{j=1}^n w_j (y_j - x_j' \gamma - f(t_j))^2 + \lambda \int_0^1 [f^{(m)}(t)]^2 dt.$$

Penyelesaian yang meminimumkan optimasi di atas adalah polinomial spline parsial terbobot.



Diberikan metode memilih  $\lambda$  optimal, sifat asimtotik, pandangan Bayes dan interval konfidensi untuk estimator spline terbobot. Diberikan pula sifat estimator spline parsial terbobot untuk  $\lambda \rightarrow \infty$  dan diselidiki sifat konsisten serta distribusi asimtotik estimator komponen parametrik dalam spline parsial terbobot. Akhirnya diberikan suatu visualisasi estimator spline terbobot dan spline parsial terbobot.



## ABSTRACT

### Spline Estimator in Nonparametric and Semiparametric Regression

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We consider the data  $(t_j, y_j)$  and we assume that the  $t_j$  and  $y_j$  are related by the nonparametric regression model :

$$y_j = f(t_j) + \varepsilon_j, j = 1, 2, \dots, n.$$

The function  $f$  is assumed to be in Sobolev space  $W_2^m[0,1]$ . The random error  $\varepsilon_j$  are independently distributed with a zero mean and with a variance  $\sigma^2/w_j$ ,  $0 < w_j < \infty$ . The estimator  $f_\lambda$  is obtained by minimizing Weighted Penalized Least Square (WPLS) :

$$n^{-1} \sum_{j=1}^n w_j (y_j - f(t_j))^2 + \lambda \int_0^1 [f^{(m)}(t)]^2 dt$$

where  $\lambda$  is the smoothing parameter. Under Reproducing Kernel Hilbert Space approach we obtained the solution of minimized WPLS as a weighted natural spline polynomial of order  $2m-1$ .

We consider the data  $(t_j, x_j, y_j)$  and we assume that the  $t_j$ ,  $x_j$  and  $y_j$  are related by the semiparametric regression model :

$$y_j = x_j' \gamma + f(t_j) + \varepsilon_j, j = 1, 2, \dots, n,$$

where  $x_j' = (x_{j1}, \dots, x_{jp})$  and  $t_j, j = 1, 2, \dots, n$  are predictor variables. The vector parameter  $\gamma = (\gamma_1, \dots, \gamma_p)' \in R^p$  is unknown and the curve  $f$  is assumed in Sobolev space  $W_2^m[0,1]$ .

The random errors  $\varepsilon_j$  are independently distributed with a zero mean and with a variance  $\sigma^2/w_j$ ,  $0 < w_j < \infty$ . The estimator  $\gamma_\lambda$  and  $f_\lambda$  are obtained by minimizing WPLS :

$$n^{-1} \sum_{j=1}^n w_j (y_j - x_j' \gamma - f(t_j))^2 + \lambda \int_0^1 [f^{(m)}(t)]^2 dt.$$

The solution of minimized WPLS above is a weighted partial spline polynomial.



Further, we give a method how to choose the smoothing parameter  $\lambda$ , asymptotic properties, Bayes estimator and the confidence interval for a weighted spline estimator. Also we give properties of weighted partial spline estimator, as  $\lambda \rightarrow \infty$ . We have investigated the consistent property and asymptotic distribution of the parametric component estimator in a weighted partial spline. Finally, we give a visualization of the weighted spline and the weighted partial spline.