HW5 - Lucas Fellmeth, Sven Bergmann

2023-11-16

1

The goal of this problem is to estimate the regression function of acceleration vs time for the mcycle data in the package MASS.

\mathbf{A}

Show that the Nadaraya-Watson estimator can be expressed as $\hat{Y} = HY$. Find the "hat matrix" H explicitly. We know that the Nadaraya-Watson estimator of $\hat{m}(x)$ is defined by

$$\hat{m}(x) = \frac{\sum_{i=1}^{n} K_h(X_i - x)Y_i}{\sum_{i=1}^{n} K_h(X_i - x)},$$

where

$$K_h(x) = \frac{1}{h}K\left(\frac{x}{h}\right)$$

with h as associated bandwidth.

В

For a reasonable range of bandwidths h, compute and plot the generalized cross validation measure GCV(h) and find the optimal bandwidth.

```
library(MASS)
library(splines)
```

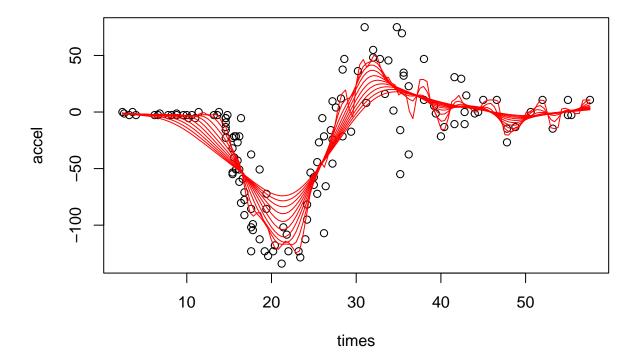
First, we implement the generalized cross validation measure GCV(h) which is defined by

$$GCV(h) = \frac{1}{n} \sum_{i=1}^{n} \left[\frac{Y_i - \hat{m}_h(x)}{1 - \frac{trS(h)}{n}} \right]^2$$

where

```
GCV <- function(h) {
    Y <- ksmooth(times, accel, "normal", bandwidth = h)$y
}</pre>
```

```
with(mcycle, {
    plot(times, accel)
    for (b in 1:10) {
        lines(ksmooth(times, accel, "normal", bandwidth = b), col = "red")
        print(ksmooth(times, accel, "normal", bandwidth = b)$y)
    }
}
```



```
##
     [1]
            -0.70495048
                           -1.30182894
                                          -1.62130427
                                                         -1.42989820
                                                                         -1.89470370
##
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                           -2.60163110
                                          -2.69223988
                                                         -2.65625186
                                                                         -2.51403550
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                                          -2.36341764
                                                         -2.65556605
                                                                         -2.47814173
##
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                                          -2.83200622
                                                         -3.48751470
                                                                         -3.80901757
##
##
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                                                                         -2.32494780
##
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                                          -2.76815997
                                                          -8.38246059
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                                                        -44.47991303
                                                                        -57.98630113
##
##
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                                                        -89.12090924
                                                                        -88.95373587
##
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                                        -112.72125251 -119.90380777
                                                                      -121.34810693
##
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                         -114.24300741
                                        -115.70716811
                                                       -119.67771404
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                                                        -72.27876824
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                                                                       -58.71128904
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                                                        -39.53253631
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##
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                                                                          2.53502445
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                                          48.05829556
                                                         38.18426768
                                                                         29.34427331
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                                                                         17.75674699
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                                                                         28.66657541
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                                                          9.27221156
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##
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   [106]
##
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##
   [111]
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##
```

```
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##
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##
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##
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##
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                                                     -13.0822032
                                                                   -18.6157078
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                                                                   -56.1038859
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                                     -116.8948445
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##
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##
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##
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##
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                                        34.0461566
                                                      40.3233679
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##
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                                        42.9081097
                                                      38.4207452
                                                                    33.1373074
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##
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                                                      13.8320041
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                                                                    -4.9089062
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##
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##
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##
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##
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                                                         18.41183191
                                                                         16.61641845
##
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                                          14.03780216
                                                         14.55675073
                                                                         15.14779327
    [86]
##
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                                                          3.12591707
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##
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##
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```

```
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##
##
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##
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##
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##
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##
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##
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##
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##
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##
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   [111]
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##
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##
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##
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##
     [1]
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                                                         -1.57730495
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##
     [6]
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##
    [11]
            -2.32740439
                           -2.40616821
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                                                                         -2.64952698
##
    [16]
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##
    [21]
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    [26]
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                                         -25.54762200
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##
##
    [31]
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                                                        -48.78449583
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##
    [36]
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##
    [41]
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                                                        -97.64730615
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##
    [51]
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##
           -86.31595657
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                                                                        -28.33230628
##
    [56]
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                                                         -34.46313501
##
    [61]
           -22.19347402
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                                          -9.73849864
                                                          -3.36881792
                                                                          3.07574983
    [66]
                                                                         29.42379482
##
             9.49670084
                           15.66946228
                                          21.28102501
                                                         25.97529680
##
    [71]
            31.49646317
                           32.19698232
                                          31.74448705
                                                         30.42937399
                                                                         28.58081001
##
            26.50665045
                           24.42067631
                                          22.46893040
                                                         20.72165347
    [76]
                                                                         19.18123330
##
    [81]
            17.82048526
                           16.57340713
                                          15.35756624
                                                         14.07887700
                                                                         12.65596772
    [86]
##
            11.05576427
                            9.32343549
                                           7.58170426
                                                           6.00521013
                                                                          4.74896143
##
    [91]
             3.91789648
                            3.51815060
                                           3.49099647
                                                           3.71958510
                                                                          4.07608200
##
    [96]
             4.44322769
                            4.73297411
                                           4.89352070
                                                           4.88958155
                                                                          4.70007288
##
   [101]
             4.29184046
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##
   [106]
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##
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