



kd

---

$dMAX \rightarrow 8$

$d2MAX \rightarrow 15$

$vcMAX \rightarrow 256$

*Codemacros:* ...eqn

$Lf \in \mathbf{R}^{0:d \times nvmax \times nf}, Old,$  ... coefficients for blending

$Lq \in \mathbf{Z}^{nvmax \times nf}, Old,$  ... indices of data points influencing each vertex

*Typemacros:*  $dMAX(dMAX,8), d2MAX(d2MAX,15), vcMAX(vcMAX,256),$  ...eqn

$a \in \mathbf{Z}^{n_{cell}}, Old(ncmax),$  ... cut coordinate (0 for leaf)

$c \in \mathbf{Z}^{vc \times n_{cell}}, Old(vc,ncmax),$  ... pointers to cell vertices

$cdeg \in \mathbf{Z}^d, Old(dMAX)$

$d \in \mathbf{Z},$  ... number of dimensions

$dd \in \mathbf{Z},$  ... only variables 1:dd enter distance calculation

$dist \in \mathbf{R}^n, Old$

$\eta \in \mathbf{R}^{nf}, Old$

$f_{cell} \in \mathbf{Z},$  ... cell count stopping tolerance

$f_{diam} \in \mathbf{R},$  ... cell diameter stopping tolerance

$hi \in \mathbf{Z}^{n_{cell}}, Old(ncmax),$  ... right subcell or point

$kernel \in \mathbf{Z},$  ... which kind of weight function

$lo \in \mathbf{Z}^{n_{cell}}, Old(ncmax),$  ... left subcell or point

$n \in \mathbf{Z},$  ... number of points

$n_{cell} \in \mathbf{Z},$  ... number of cells

$n_{vert} \in \mathbf{Z},$  ... number of vertices

$ncmax, nf \in \mathbf{Z}$

$nvmax \in \mathbf{Z},$  ... allocated size of v

$\pi \in \mathbf{Z}^n, Permutation, Old,$  ... with *lo*, *hi* lists points in cells

*plot:* *Plot*

$\psi \in \mathbf{Z}^n, Permutation, Old,$  ... workspace for sorting distances

$rw \in \mathbf{R}^n, Old,$  ... user-specified weights

*setLf:* *Logical,* ... should *Lq*, *Lf* be filled in?

$tdeg \in \mathbf{Z},$  ... total degree

$trL \in \mathbf{R},$  ... trace L

$v \in \mathbf{R}^{n_{vert} \times d}, Old(nvmax, d),$  ... vertices

$vc \in \mathbf{Z},$  ...  $2^d$  = number of vertices per cell

$white \in \mathbf{Z}^{n_{vert}}, Old(nvmax)$

$x \in \mathbf{R}^{n \times d}, Old,$  ... locations of input data

$\xi \in \mathbf{R}^{n_{cell}}, Old(ncmax),$  ... cut value

$y \in \mathbf{R}^n, Old$

/u3/ehg/a/loess/kd.h

Fri Mar 16 12:45:16 1990

---

*INFO* → 1  
*D* → 2  
*N* → 3  
*VC* → 4  
*NC* → 5  
*NV* → 6  
*A1* → 7  
*C1* → 8  
*HI1* → 9  
*LO1* → 10  
*V1* → 11  
 $\Xi 1$  → 12  
*VV1* → 13  
*NVMAX* → 14  
*WORK1* → 15  
*WORK2* → 16  
*NCMAX* → 17  
*WORK3* → 18  
*NF* → 19  
*KERNEL* → 20  
*KIND* → 21  
 $\Pi 1$  → 22  
*VH* → 23  
*VV2* → 24  
*DIAGL* → 25  
*WORK4* → 26  
 $\Psi 1$  → 27  
*SEQ* → 28  
*DIM* → 29  
*SING* → 30  
*PRINT* → 31  
*DEG* → 32  
*NDIST* → 33  
*CDEG* → 41  
*F* → 1  
*FCELL* → 2  
*FDIAM* → 3  
*RCOND* → 4

*Codemacros:* ...eqn

*Typemacros:* *INFO*(*INFO*,1),*D*(*D*,2),*N*(*N*,3),*VC*(*VC*,4),*NC*(*NC*,5),*NV*(*NV*,6),*A1*(*A1*,7),*C1*(*C1*,8),*HI1*(*HI1*,9),*LO1*(*LO1*,10),*V1*(*V1*,11), $\Xi 1$ ( $\Xi 1$ ,12),*VV1*(*VV1*,13),*NVMAX*(*NVMAX*,14),*WORK1*(*WORK1*,15),*WORK2*(*WORK2*,16),*N*

*KIND(KIND,21),PI1(Π1,22),VH(VH,23),VV2(VV2,24),DIAGL(DIAGL,25),WORK4(WORK4,26),PSI1(Ψ1,27),  
PRINT(PRINT,31),DEG(DEG,32),NDIST(NDIST,33),CDEG(CDEG,41),F(F,1),FCELL(FCELL,2),FDIA*

/u3/ehg/a/loess/iv.h  
Thu Jan 25 16:17:56 1990

routines

---

*Assert*(%?,%ma,%i,%mi) → *bold* if (!%ma,ehg182(%mi))

*Codemacros*: *myAssert*(*Assert*(%?,%ma,%i,%mi),

*bold*

if

(!%ma,ehg182(%mi))), ...eqn

*Typemacros*: ...eqn

bbox≡ehg126

cpvert≡ehg125

descend≡ehg138

eval≡ehg128

l2fit≡ehg136

l2tr≡ehg139

rbuild≡ehg124

spread≡ehg129

vleaf≡ehg137

/u3/ehg/a/loess/routines.h

Fri Mar 9 16:34:12 1990

ehg126

bbox( $d, n, vc, x, v, nvmax$ )

... fill in vertices for bounding box of  $x$

... lower left, upper right

for  $1 \leq k \leq d$

$\alpha := \infty$

$\beta := -\infty$

for  $1 \leq i \leq n$

$t := x_{i,k}$

$\alpha := \text{Min}(\alpha, t)$

$\beta := \text{Max}(\beta, t)$

... expand the box a little

$\mu := 0.005 \cdot \text{Max}(\beta - \alpha, 1.e - 10 \cdot \text{Max}(|\alpha|, |\beta|) + 1.e - 30)$

$\alpha -= \mu$

$\beta += \mu$

$v_{1,k} := \alpha$

$v_{vc,k} := \beta$

... remaining vertices

for  $2 \leq i \leq vc - 1$

$j := i - 1$

for  $1 \leq k \leq d$

$v_{i,k} := v_{1+(j \bmod 2) \cdot (vc-1),k}$

$j := \text{Floor}(j/2)$

---

$\alpha, \beta \in \mathbf{R}$

$i \in \mathbf{Z}$

$j \in \mathbf{N}$

$k \in \mathbf{Z}$

$\mu, t \in \mathbf{R}$

Include: kd

/u3/ehg/a/loess/bbox.g

Wed Aug 3 12:52:15 1988

ehg125

$\text{cpvert}(p, n_{\text{vert}}, v, \text{vhit}, \text{nvmax}, d, k, t, r, s,$   
 $f, l, u)$

```
h := nvert
for 1 ≤ i ≤ r
  for 1 ≤ j ≤ s
    h += 1
    vh,: := vfi,0,j:
    vh,k := t
    ... check for redundant vertex
    match := False
    m := 1
    while !match and m ≤ nvert
      match := vm,1 = vh,1
      mm := 2
      while match and mm ≤ d
        match := vm,mm = vh,mm
        mm += 1
      m += 1
    m -= 1
    if match
      h -= 1
    else
      m := h
      if vhit1 ≥ 0
        vhitm := p
      li,0,j := fi,0,j
      li,1,j := m
      ui,0,j := m
      ui,1,j := fi,1,j
nvert := h
Assert(nvert ≤ nvmax, 180)
```

---

$f \in \mathbf{Z}^{r \times 0:1 \times s}, \text{Old},$  ... vertex indices of father  
 $h \in \mathbf{Z},$  ... highest vertex index created so far  
 $i, j \in \mathbf{Z}$   
 $k \in \mathbf{Z},$  ... cut axis  
 $l \in \mathbf{Z}^{r \times 0:1 \times s}, \text{Old},$  ... vertex indices of left son  
 $m \in \mathbf{Z}$   
 $\text{match}: \text{Logical}$   
 $mm \in \mathbf{Z}$   
 $p \in \mathbf{Z},$  ... index of father cell

$r, s \in \mathbf{Z}$

$t \in \mathbf{R}, \quad \dots \text{ cut}$

$u \in \mathbf{Z}^{r \times 0:1 \times s}, Old, \quad \dots \text{ vertex indices of right son}$

Include: kd routines

/u3/ehg/a/loess/cpvert.g

Thu Sep 15 22:59:57 1988



ehg138

$j := \text{descend}(i, z, a, \xi, lo, hi, ncmax)$

... descend tree until leaf or ambiguous

$j := i$

**while**  $a_j \neq 0$  **and**  $z_{a_j} \neq \xi_j$

**if**  $z_{a_j} < \xi_j$

$j := lo_j$

**else**

$j := hi_j$

---

$a \in \mathbb{Z}^{n_{cell}}, In, Old(ncmax),$  ... cut coordinate (0 for leaf)

$d \in \mathbb{Z},$  ... number of dimensions

$hi \in \mathbb{Z}^{n_{cell}}, In, Old(ncmax),$  ... right subcell or point

$i \in \mathbb{Z}, In$

$j \in \mathbb{Z}$

$lo \in \mathbb{Z}^{n_{cell}}, In, Old(ncmax),$  ... left subcell or point

$\xi \in \mathbb{R}^{n_{cell}}, In, Old(ncmax),$  ... cut value

$z \in \mathbb{R}^d, Old(dMAX), In$

Include: kd

/u3/ehg/a/loess/descend.g

Fri Aug 14 09:20:31 1987

ehg106(*il,ir,k,nk,p,π,n*)

... find the  $k$ -th smallest of  $n$  elements

... Floyd+Rivest, CACM Mar '75, Algorithm 489

$l := il$

$r := ir$

**while**  $r > l$

... to avoid recursion, sophisticated partition deleted

... partition  $x_{l..r}$  about  $t$

$t := p_{1,\pi_k}$

$i := l$

$j := r$

Swap( $l,k$ )

**if**  $p_{1,\pi_r} > t$

Swap( $l,r$ )

**while**  $i < j$

Swap( $i,j$ )

$i += 1$

$j -= 1$

**while**  $p_{1,\pi_i} < t$

$i += 1$

**while**  $p_{1,\pi_j} > t$

$j -= 1$

**if**  $p_{1,\pi_i} = t$

Swap( $l,j$ )

**else**

$j += 1$

Swap( $r,j$ )

**if**  $j \leq k$

$l := j + 1$

**if**  $k \leq j$

$r := j - 1$

---

Swap( $\%?, \%ma, \%?, \%mb$ )  $\rightarrow \{ii := \pi_{\%ma}, \pi_{\%ma} := \pi_{\%mb}, \pi_{\%mb} := ii\}$

$i, il, ir, j \in \mathbb{Z}$

$k \in \mathbb{Z}$ , ... select  $k$ -th element

$l, n, nk \in \mathbb{Z}$

$p \in \mathbb{R}^{nk \times n}, Old$

$\pi \in \mathbb{Z}^n, Old$

$r \in \mathbb{Z}$

$t \in \mathbb{R}$

/u3/ehg/a/loess/ehg106.g

```
ehg127(q,n,d,nf,f,x,ψ,y,rw, kernel,
      k,dist,η,X,od,w,rcond,sing,Σ,U,
      V,γ,qraux,work,tol,dd,tdeg,cdeg,s)
```

```
... sort by distance
```

```
  dist := 0
  for 1 ≤ j ≤ dd
    dist += (x[:,j] - qj)2
  PartialSort(1,n,nf,dist,ψ)
  ρ := distψnf · Max(1.,f)
  Assert(ρ > 0,120)
```

```
... compute neighborhood weights
```

```
  if kernel = 2
    for 1 ≤ i ≤ nf
      wi := if(distψi < ρ, √(rwψi), else, 0)
  else
    w := √(distψ / ρ)
    w := √(rwψ · (1 - w3)3)
    Assert(|| w ||∞ > 0,121)
```

```
... fill design matrix
```

```
  column := 1
  X[:,column] := w
  if tdeg ≥ 1
    for 1 ≤ j ≤ d
      if cdegj ≥ 1
        column += 1
        X[:,column] := w · (xψ,j - qj)
  if tdeg ≥ 2
    for 1 ≤ j ≤ d
      if cdegj ≥ 1
        if cdegj ≥ 2
          column += 1
          X[:,column] := w · (xψ,j - qj)2
        for j + 1 ≤ jj ≤ d
          if cdegjj ≥ 1
            column += 1
            X[:,column] := w · (xψ,j - qj) · (xψ,jj - qjj)
  k := column
```

```
  η := w · yψ
```

```
... equilibrate columns
```

```
  for 1 ≤ j ≤ k
    scal := || X[:,j] ||2
    X[:,j] /= scal
```

```

    colnormj := scal
... singular value decomposition
    sqrdc(X,nf,nf,k,qraux,jpvt,work,0)
    sqrs1(X,nf,nf,k,qraux,η,work,η,η,work,
        work,1000,info
    )
    U := 0
    for 1 ≤ i ≤ k
        for i ≤ j ≤ k
            Ui,j := Xi,j
    ssvdc(U,d2MAX,k,k,Σ,E,U,d2MAX,V,d2MAX,
        work,21,info
    )
    Assert(info = 0,182)
    tol := Σ1 · (100 · εmach)
    rcond min = Σk / Σ1
    if Σk ≤ tol
        sing += 1
        if sing = 1
            ehg184("Warning. pseudoinverse used at",q,d,1)
            ehg184("neighborhood radius",√ρ,1,1)
            ehg184("reciprocal condition number ",rcond,1,1)
        else if sing = 2
            ehg184("There are other near singularities as well.",p,1,1)
... compensate for equilibration
    for 1 ≤ j ≤ k
        Vj,:  /= colnormj
... solve least squares problem
    for 1 ≤ j ≤ k
        γj := if(Σj > tol,  $\frac{\langle U_{:,j}, \eta \rangle}{\Sigma_j}$ , else, 0.)
    for 0 ≤ j ≤ od
        sj := <Vj+1,: , γ>

```

---

$E \in \mathbf{R}^{d2MAX}$ , Old, ... workspace for svd  
 $\Sigma \in \mathbf{R}^k$ , Old(d2MAX), Out  
 $U \in \mathbf{R}^{k \times k}$ , Old(d2MAX,d2MAX), Out, ... upper triangular factor  
 $V \in \mathbf{R}^{k \times k}$ , Old(d2MAX,d2MAX), Out  
 $X \in \mathbf{R}^{nf \times k}$ , Old  
 $colnorm \in \mathbf{R}^{1:k}$ , Old(1:d2MAX)  
 $column \in \mathbf{Z}$   
 $dist \in \mathbf{R}^n$ , Old  
 $\eta \in \mathbf{R}^{nf}$ , Old  
 $f \in \mathbf{R}$ , In

$\gamma \in \mathbf{R}^k, Old(d2MAX), Out, \dots \Sigma^+ U^T Q^T W y$   
 $i, info, j, jj, jpvt \in \mathbf{Z}$   
 $k \in \mathbf{Z}, \dots$  dimension of fit 1=const, d+1=linear, (d+2)(d+1)/2=quadratic  
 $nf \in \mathbf{Z}, \dots$  number of "near" neighbors  
 $od \in \mathbf{Z}, \dots$  0 means caller wants values only  
 $q \in \mathbf{R}^d, Old(d), \dots$  query point  
 $qaux \in \mathbf{R}^{d2MAX}, Old, Out$   
 $rcond \in \mathbf{R}, In, Out, \dots$  reciprocal condition number  
 $\rho \in \mathbf{R}$   
 $s \in \mathbf{R}^{0:od}, Old, \dots$  smoothed values  
 $scal \in \mathbf{R}$   
 $sing \in \mathbf{Z}, In, Out, \dots$  singularity count  
 $tol \in \mathbf{R}, Out$   
 $w \in \mathbf{R}^{nf}, Old, \dots$  workspace for regression weights  
 $work \in \mathbf{R}^{d2MAX}, Old, Out$   
 $y \in \mathbf{R}^n, Old$   
Include: kd routines lin  
/u3/ehg/a/loess/ehg127.g  
Thu Jul 12 09:22:32 1990

```
ehg131(x,y,rw,trL,diagL,kernel,k,n,d,ncell,
      ncmax,vc,nvert,nvmax,nf,f,a,c,hi,lo,
      π,ψ,v,vhit,vval,ξ,dist,η,X,ntol,
      fdiam,w,vval2,rcond,sing,dd,tdeg,cdeg,Lq,Lf,
      setLf)
```

```
Assert(d ≤ dMAX, 101)
```

```
... build k-d tree
```

```
  bbox(d,n,vc,x,v,nvmax)
  nvert := vc
  ncell := 1
  for 1 ≤ j ≤ vc
    cj,ncell := j
    vhitj := 0
  δ := vvc,1:dd - v1,1:dd
  fdiam * = || δ ||2
  π := Identity
  rbuild(1,n,d,n,nvert,ncell,ncmax,vc,x,π,
        a,ξ,lo,hi,c,v,vhit,nvmax,ntol,fdiam,
        dd
  )
```

```
... smooth
```

```
  if trL ≠ 0
    vval2 := 0
  vval := l2tr(v,nvmax,nvert,n,d,nf,f,x,π,ψ,
    y,rw,trL,kernel,k,dist,dist,η,X,d,
    w,diagL,vval2,ncell,vc,a,ξ,lo,hi,c,
    vhit,rcond,sing,dd,tdeg,cdeg,Lq,Lf,setLf
  )
```

---

$X \in \mathbf{R}^d, Old$

$bbox \equiv ehg126$

$\delta \in \mathbf{R}^d, Old(dMAX)$

$diagL \in \mathbf{R}^n, Old$

$dist \in \mathbf{R}^n, Old$

$f \in \mathbf{R}, In$

$j, k \in \mathbf{Z}$

$nf \in \mathbf{Z}, \dots$  number of "near" neighbors

$ntol \in \mathbf{Z}$

$rbuild \equiv ehg124$

$rcond \in \mathbf{R}, Out, \dots$  reciprocal condition number

$sing \in \mathbf{Z}, In, Out$

$vval \in \mathbf{R}^{0:d \times n_{vert}}, Old(0:d, nvmax), \dots$  smoothed values at vertices

$vval2 \in \mathbf{R}^{0:d \times n_{vert}}, Old(0:dMAX, nvmax)$

No! Should be d.

$w \in \mathbf{R}^{nf}, Old$ , ... workspace for l2fit  
 $y \in \mathbf{R}^n$ , ... observations ,*Old*  
Include: kd routines approx lin  
/u3/ehg/a/loess/ehg131.g  
Sat Mar 17 10:33:58 1990

```
ehg133( $n, d, vc, nvmax, n_{cell}, ncmax, a, c, hi, lo,$   

 $v, vval, \xi, m, z, s$ )
```

```
for  $1 \leq i \leq m$   

 $\delta := z_{i,:}$   

 $s_i := \text{eval}(\delta, d, ncmax, vc, a, \xi, lo, hi, c, v,$   

 $nvmax, vval$   

 $)$ 
```

---

$\delta \in \mathbf{R}^d, Old(dMAX)$

$i, m \in \mathbf{Z}$

$s \in \mathbf{R}^m, Old$

$vval \in \mathbf{R}^{0:d \times n_{wt}}, Old(0:d, nvmax), \dots$  smoothed values at vertices

$z \in \mathbf{R}^{m \times d}, Old$

Include: kd routines approx lin

/fs/pyxis6/ehg/a/loess/ehg133.g

Wed May 29 14:00:58 1991



ehg140(*iw,i,j*)

*iw<sub>i</sub>* := *j*

---

*i* ∈ **Z**

*iw* ∈ **Z**<sup>*i*</sup>, *Old, In, Out*

*j* ∈ **Z**

/u3/ehg/a/loess/ehg140.g

Wed Aug 12 14:10:08 1987

```
ehg169( $d, vc, n_{cell}, ncmax, n_{vert}, nvmax, v, a, \xi, c,$ 
       $hi, lo$ )
```

... as in bbox

... remaining vertices

```
for  $2 \leq i \leq vc - 1$ 
```

```
   $j := i - 1$ 
```

```
  for  $1 \leq k \leq d$ 
```

```
     $v_{i,k} := v_{1+(j \bmod 2) \cdot (vc-1),k}$ 
```

```
     $j := \text{Floor}(j/2)$ 
```

... as in ehg131

```
 $m_{cell} := 1$ 
```

```
 $m_{vert} := vc$ 
```

```
 $novhit_1 := -1$ 
```

```
for  $1 \leq j \leq vc$ 
```

```
   $c_{j,m_{cell}} := j$ 
```

... as in rbuild

```
 $p := 1$ 
```

```
while  $p \leq n_{cell}$ 
```

```
  if  $a_p \neq 0$ 
```

```
     $k := a_p$ 
```

```
    ... left son
```

```
       $m_{cell} += 1$ 
```

```
       $lo_p := m_{cell}$ 
```

```
    ... right son
```

```
       $m_{cell} += 1$ 
```

```
       $hi_p := m_{cell}$ 
```

```
       $cpvert(p, m_{vert}, v, novhit, nvmax, d, k, \xi_p, 2^{k-1}, 2^{d-k},$ 
```

```
         $c_{:,p}, c_{:,lo_p}, c_{:,hi_p}$ 
```

```
      )
```

```
       $p += 1$ 
```

```
Assert( $m_{cell} = n_{cell}, 193$ )
```

```
Assert( $m_{vert} = n_{vert}, 193$ )
```

---

$i, j, k \in \mathbb{Z}$

$m_{cell} \in \mathbb{Z}$ , ... local version of  $n_{cell}$

$m_{vert} \in \mathbb{Z}$ , ... local version of  $n_{vert}$

$novhit \in \mathbb{Z}^1, Old$ , ... dummy

$p \in \mathbb{Z}$ , ... cell index

Include: kd routines

/u3/ehg/a/loess/ehg169.g

Thu Sep 15 23:04:06 1988

```
ehg170(k,d,vc,nvert,nvmax,ncell,ncmax,a,c,hi,
      lo,v,vval,ξ)
```

```
Out("    real function loeval(z)")
Out("    real z(*)")
Out("    integer d,vc,nv,nc")
Out("    integer a(",ncell,"), c(",vc,"",ncell,"")")
Out("    integer hi(",ncell,"), lo(",ncell,"")")
Out("    real v(",nvert,"",d,"")")
Out("    real vval(0:",d,"",nvert,"")")
Out("    real xi(",ncell,"")")
Out("    real ehg128")
Out("    data d,vc,nv,nc /",d,"",vc,"",nvert,"",ncell,"/")
for 1≤i≤ncell
    Out("    data a(",i,") /",ai,"/")
    if ai≠0
        Out("    data hi(",i,"),lo(",i,"),xi(",i,") /",hii,"",loi,
            ",",ξi,"/")
    )
    for 1≤j≤vc
        Out("    data c(",j,"",i,") /",cj,i,"/")
for 1≤i≤nvert
    Out("    data vval(0,",i,") /",vval0,i,"/")
    for 1≤j≤d
        Out("    data v(",i,"",j,") /",vi,j,"/")
        Out("    data vval(",j,"",i,") /",vvalj,i,"/")
Out("    loeval=ehg128(z,d,nc,vc,a,xi,lo,hi,c,v,nv,vval)")
Out("    end")
```

---

*i,j* ∈  $\mathbf{Z}$

*vval* ∈  $\mathbf{R}^{0:d \times nvmax}, Old$

Include: kd

/u3/ehg/a/loess/ehg170.g

Thu Sep 15 08:59:07 1988

```
ehg191(m,z,L,d,n,nf,nvert,ncmax,vc,a,
      ξ,lo,hi,c,v,nvmax,vval2,Lf,Lq)
```

```
for 1 ≤ j ≤ n
  vval2 := 0
  for 1 ≤ i ≤ nvert
    ... linear search for i in Lq
      Lq1 := Lqi,1
      Lqi,1 := j
      p := nf
      while Lqi,p ≠ j
        p -= 1
      Lqi,1 := Lq1
    if Lqi,p = j
      vval2.,i := Lf.,i,p
  for 1 ≤ i ≤ m
    zi := zi,:
    Li,j := eval(zi,d,ncmax,vc,a,ξ,lo,hi,c,v,
      nvmax,vval2
    )
```

---

$L \in \mathbb{R}^{m \times n}, Old$

$Lq1, i, j, m, p \in \mathbb{Z}$

$vval2 \in \mathbb{R}^{0:d \times n_{vert}}, Old(0:d, nvmax)$

$z \in \mathbb{R}^{m \times d}, Old$

$zi \in \mathbb{R}^d, Old(0:dMAX)$

22 Jun 92

Include: kd routines

/u3/ehg/a/loess/ehg191.g

Wed Apr 4 23:41:24 1990

ehg192( $y, d, n, nf, n_{vert}, nvmax, vval, Lf, Lq$ )

$vval := 0$

for  $1 \leq i \leq n_{vert}$

for  $1 \leq j \leq nf$

$vval_{:,i} += y_{Lq_{i,j}} \cdot Lf_{:,i,j}$

---

$i, j \in \mathbf{Z}$

$vval \in \mathbf{R}^{0:d \times n_{vert}}, Old(0:d, nvmax)$

Include: kd routines

/u3/ehg/a/loess/ehg192.g

Tue Apr 3 21:31:35 1990

ehg128

$s := \text{eval}(z, d, ncmax, vc, a, \xi, lo, hi, c, v,$   
           $nvmax, vval)$

... locate enclosing cell

$nt := 1$   
   $t_{nt} := 1$   
   $j := 1$   
  while  $a_j \neq 0$   
     $++nt$   
     $t_{nt} := \text{if}(z_{a_j} < \xi_j, lo_j, \text{else}, hi_j)$   
    Assert( $nt < 20, 181$ )  
     $j := t_{nt}$

... tensor

$g := vval_{:,c,j}$   
   $lg := vc$   
   $ll := c_{1,j}$   
   $ur := c_{vc,j}$   
  for  $d \geq i \geq 1$   
     $h := \frac{z_i - v_{ll,i}}{v_{ur,i} - v_{ll,i}}$   
    if  $h < -.001$   
      ehg184("eval ",  $z, d, 1$ )  
      ehg184("lowerlimit ",  $v_{ll,:}, d, nvmax$ )  
    else if  $h > 1.001$   
      ehg184("eval ",  $z, d, 1$ )  
      ehg184("upperlimit ",  $v_{ur,:}, d, nvmax$ )  
    Assert( $-.001 \leq h$  and  $h \leq 1.001, 122$ )  
     $lg := \text{Floor}(lg/2)$   
    for  $1 \leq ig \leq lg$   
      ... Hermite basis  
       $\phi 0 := (1-h)^2 \cdot (1+2 \cdot h)$   
       $\phi 1 := h^2 \cdot (3-2 \cdot h)$   
       $\psi 0 := h \cdot (1-h)^2$   
       $\psi 1 := h^2 \cdot (h-1)$   
       $g_{0,ig} := \phi 0 \cdot g_{0,ig} + \phi 1 \cdot g_{0,ig+lg} + (\psi 0 \cdot g_{i,ig} + \psi 1 \cdot g_{i,ig+lg}) \cdot (v_{ur,i} - v_{ll,i})$   
      for  $1 \leq ii \leq i-1$   
         $g_{ii,ig} := \phi 0 \cdot g_{ii,ig} + \phi 1 \cdot g_{ii,ig+lg}$   
   $s := g_{0,1}$   
... blending  
  if  $d = 2$   
    ... ----- North -----  
     $v0 := v_{ll,1}$

```

v1 := vwr,1
g0 := vval·,c3,j
g1 := vval·,c4,j
 $\bar{\xi}$  := vwr,2
m := nt - 1
until (m = 0 or (atm = 2 and  $\xi_{t_m} = \bar{\xi}$ ))
  --m
if m ≥ 1
  m := hitm
  while am ≠ 0
    if zam <  $\xi_m$ 
      m := lom
    else
      m := him
  if vc1,m,1 > v0
    v0 := vc1,m,1
    g0 := vval·,c1,m
  if vc2,m,1 < v1
    v1 := vc2,m,1
    g1 := vval·,c2,m
h :=  $\frac{z_1 - v0}{v1 - v0}$ 
... Hermite basis
 $\phi0 := (1-h)^2 \cdot (1+2 \cdot h)$ 
 $\phi1 := h^2 \cdot (3-2 \cdot h)$ 
 $\psi0 := h \cdot (1-h)^2$ 
 $\psi1 := h^2 \cdot (h-1)$ 
gN :=  $\phi0 \cdot g0_0 + \phi1 \cdot g1_0 + (\psi0 \cdot g0_1 + \psi1 \cdot g1_1) \cdot (v1 - v0)$ 
gpN :=  $\phi0 \cdot g0_2 + \phi1 \cdot g1_2$ 
... ----- South -----
v0 := vll,1
v1 := vwr,1
g0 := vval·,c1,j
g1 := vval·,c2,j
 $\bar{\xi}$  := vll,2
m := nt - 1
until (m = 0 or (atm = 2 and  $\xi_{t_m} = \bar{\xi}$ ))
  --m
if m ≥ 1
  m := lotm
  while am ≠ 0
    if zam <  $\xi_m$ 

```

```

        m := lo_m
    else
        m := hi_m
    if v_{c_{3,m},1} > v0
        v0 := v_{c_{3,m},1}
        g0 := vval[:,c_{3,m}]
    if v_{c_{4,m},1} < v1
        v1 := v_{c_{4,m},1}
        g1 := vval[:,c_{4,m}]
    h := (z1 - v0) / (v1 - v0)
    ... Hermite basis
    phi0 := (1-h)^2 * (1+2*h)
    phi1 := h^2 * (3-2*h)
    psi0 := h * (1-h)^2
    psi1 := h^2 * (h-1)
    gS := phi0 * g0_0 + phi1 * g1_0 + (psi0 * g0_1 + psi1 * g1_1) * (v1 - v0)
    gpS := phi0 * g0_2 + phi1 * g1_2
... ----- East -----
    v0 := v_{ll,2}
    v1 := v_{ur,2}
    g0 := vval[:,c_{2,j}]
    g1 := vval[:,c_{4,j}]
    xi_bar := v_{ur,1}
    m := nt - 1
    until (m = 0 or (a_{t_m} = 1 and xi_{t_m} = xi_bar))
        --m
    if m >= 1
        m := hi_{t_m}
        while a_m != 0
            if z_{a_m} < xi_m
                m := lo_m
            else
                m := hi_m
        if v_{c_{1,m},2} > v0
            v0 := v_{c_{1,m},2}
            g0 := vval[:,c_{1,m}]
        if v_{c_{3,m},2} < v1
            v1 := v_{c_{3,m},2}
            g1 := vval[:,c_{3,m}]
    h := (z2 - v0) / (v1 - v0)

```



```

... Hermite basis
   $\phi 0 := (1-h)^2 \cdot (1+2 \cdot h)$ 
   $\phi 1 := h^2 \cdot (3-2 \cdot h)$ 
   $\psi 0 := h \cdot (1-h)^2$ 
   $\psi 1 := h^2 \cdot (h-1)$ 
   $gE := \phi 0 \cdot g0_0 + \phi 1 \cdot g1_0 + (\psi 0 \cdot g0_2 + \psi 1 \cdot g1_2) \cdot (v1 - v0)$ 
   $gpE := \phi 0 \cdot g0_1 + \phi 1 \cdot g1_1$ 
... ----- West -----
   $v0 := v_{ll,2}$ 
   $v1 := v_{ur,2}$ 
   $g0 := vval_{:,c_{1,j}}$ 
   $g1 := vval_{:,c_{3,j}}$ 
   $\bar{\xi} := v_{ll,1}$ 
   $m := nt - 1$ 
  until ( $m = 0$  or ( $a_{t_m} = 1$  and  $\xi_{t_m} = \bar{\xi}$ ))
    --m
  if  $m \geq 1$ 
     $m := lo_{t_m}$ 
    while  $a_m \neq 0$ 
      if  $z_{a_m} < \xi_m$ 
         $m := lo_m$ 
      else
         $m := hi_m$ 
    if  $v_{c_{2,m},2} > v0$ 
       $v0 := v_{c_{2,m},2}$ 
       $g0 := vval_{:,c_{2,m}}$ 
    if  $v_{c_{4,m},2} < v1$ 
       $v1 := v_{c_{4,m},2}$ 
       $g1 := vval_{:,c_{4,m}}$ 
   $h := \frac{z_2 - v0}{v1 - v0}$ 
... Hermite basis
   $\phi 0 := (1-h)^2 \cdot (1+2 \cdot h)$ 
   $\phi 1 := h^2 \cdot (3-2 \cdot h)$ 
   $\psi 0 := h \cdot (1-h)^2$ 
   $\psi 1 := h^2 \cdot (h-1)$ 
   $gW := \phi 0 \cdot g0_0 + \phi 1 \cdot g1_0 + (\psi 0 \cdot g0_2 + \psi 1 \cdot g1_2) \cdot (v1 - v0)$ 
   $gpW := \phi 0 \cdot g0_1 + \phi 1 \cdot g1_1$ 
... NS
   $h := \frac{z_2 - v_{ll,2}}{v_{ur,2} - v_{ll,2}}$ 
... Hermite basis
   $\phi 0 := (1-h)^2 \cdot (1+2 \cdot h)$ 

```

$$\begin{aligned}\phi 1 &:= h^2 \cdot (3 - 2 \cdot h) \\ \psi 0 &:= h \cdot (1 - h)^2 \\ \psi 1 &:= h^2 \cdot (h - 1) \\ s_{NS} &:= \phi 0 \cdot gS + \phi 1 \cdot gN + (\psi 0 \cdot gpS + \psi 1 \cdot gpN) \cdot (v_{ur,2} - v_{ll,2}) \\ \dots & \text{EW} \\ h &:= \frac{z_1 - v_{ll,1}}{v_{ur,1} - v_{ll,1}} \\ \dots & \text{Hermite basis} \\ \phi 0 &:= (1 - h)^2 \cdot (1 + 2 \cdot h) \\ \phi 1 &:= h^2 \cdot (3 - 2 \cdot h) \\ \psi 0 &:= h \cdot (1 - h)^2 \\ \psi 1 &:= h^2 \cdot (h - 1) \\ s_{EW} &:= \phi 0 \cdot gW + \phi 1 \cdot gE + (\psi 0 \cdot gpW + \psi 1 \cdot gpE) \cdot (v_{ur,1} - v_{ll,1}) \\ s &:= (s_{NS} + s_{EW}) - s\end{aligned}$$


---

$g \in \mathbf{R}^{0:d \times vc}, Old(0:dMAX, vcMAX), \dots$   $vval$  workspace  
 $g0 \in \mathbf{R}^{0:d}, Old(0:dMAX)$   
 $g1 \in \mathbf{R}^{0:d}, Old(0:dMAX)$   
 $gE, gN, gS, gW, gpE, gpN, gpS, gpW, h \in \mathbf{R}$   
 $i, ig, ii \in \mathbf{Z}$   
 $j \in \mathbf{Z}, \dots$  enclosing cell  
 $lg \in \mathbf{N}, \dots$  active length of  $g$   
 $ll \in \mathbf{Z}, \dots$  lower left vertex  
 $m \in \mathbf{Z}, \dots$  going up: depth in stack; going down: cell  
 $nt \in \mathbf{Z}, \dots$  top of cell stack  
 $phi0, phi1, psi0, psi1, s, s_{EW}, s_{NS} \in \mathbf{R}$   
 $t \in \mathbf{Z}^{20}, Old, \dots$  stack of cell from root to leaf  
 $ur \in \mathbf{Z}, \dots$  upper right vertex  
 $v0, v1 \in \mathbf{R}$   
 $vval \in \mathbf{R}^{0:d \times nvmax}, Old, \dots$  vertex values  
 $\bar{\xi} \in \mathbf{R}, \dots$  cut-value forming cell side  
 $z \in \mathbf{R}^d, Old$   
 Include: kd routines  
 /u3/ehg/a/loess/eval.g  
 Thu Jan 25 16:27:38 1990

ehg136

```
s := l2fit(u,lm,m,n,d,nf,f,x,ψ,y,  
          rw,kernel,k,dist,η,X,od,L,ihat,w,  
          rcond,sing,dd,tdeg,cdeg)
```

```
Assert( $k \leq nf - 1$ , 104)
```

```
Assert( $k \leq d2MAX$ , 105)
```

```
ψ := Identity
```

```
for 1 ≤ l ≤ m
```

```
  q := ul;
```

```
  ehg127(q,n,d,nf,f,x,ψ,y,rw,kernel,  
        k,dist,η,X,od,w,rcond,sing,Σ,U,  
        V,γ,graux,work,tol,dd,tdeg,cdeg,s:,l  
  )
```

```
  if ihat = 1 ... Ll,l = V1,: Σ+ UT (QT W ei)
```

```
    Assert(m = n, 123)
```

```
    ... find i such that l = ψi
```

```
      i := 1
```

```
      while l ≠ ψi
```

```
        i += 1
```

```
        Assert(i < nf, 123)
```

```
    η := 0
```

```
    ηi := wi
```

```
    ... η = QT W ei
```

```
      sqrs1(X,nf,nf,k,graux,η,η,η,η,η,  
            η,1000,info
```

```
    )
```

```
    ... γ = UT η1:k
```

```
    γ := 0
```

```
    for 1 ≤ j ≤ k
```

```
      γ += ηj · Uj,: :
```

```
    ... γ = Σ+ γ
```

```
    for 1 ≤ j ≤ k
```

```
      if Σj > tol
```

```
        γj /= Σj
```

```
      else
```

```
        γj := 0.
```

```
    Ll,1 := <V1,: :, γ>
```

```
  else if ihat = 2 ... Ll,: : = V1,: : Σ+ (UT QT) W
```

```
    Ll,: : := 0
```

```
    for 1 ≤ j ≤ k
```

```
      η := 0
```

```
      η1:k := U:,j
```

```

    sqrrsl(X,nf,nf,k,graux,η,η,work,work,work,
           work,10000,info
    )
    if Σj>tol
        scale := 1./Σj
    else
        scale := 0.
    η *= scale·w
    for 1≤i≤nf
        Li,ψi += V1,j·ηi

```

---

$L \in \mathbf{R}^{m \times n}, Old, Out,$  ... if hat=1, dimension n by 1  
 $\Sigma \in \mathbf{R}^k, Old(d2MAX)$   
 $U \in \mathbf{R}^{k \times k}, Old(d2MAX, d2MAX),$  ... upper triangular factor  
 $V \in \mathbf{R}^{k \times k}, Old(d2MAX, d2MAX)$   
 $X \in \mathbf{R}^{nf \times k}, Old$   
 $dist \in \mathbf{R}^n, Old$   
 $\eta \in \mathbf{R}^{nf}, Old$   
 $f \in \mathbf{R}, In$   
 $\gamma \in \mathbf{R}^k, Old(d2MAX),$  ...  $\Sigma^+ U^T Q^T W y$   
 $i \in \mathbf{Z}$   
 $ihat \in \mathbf{Z}, In$   
 $info, j \in \mathbf{Z}$   
 $k \in \mathbf{Z},$  ... dimension of fit 1=const, d+1=linear, (d+2)(d+1)/2=quadratic  
 $l, lm, m \in \mathbf{Z}$   
 $nf \in \mathbf{Z},$  ... number of "near" neighbors  
 $od \in \mathbf{Z},$  ... 0 means caller wants values only  
 $q \in \mathbf{R}^d, Old(dMAX),$  ...  $u(1,:)$   
 $graux \in \mathbf{R}^{d2MAX}, Old$   
 $rcond \in \mathbf{R}, In, Out,$  ... reciprocal condition number  
 $s \in \mathbf{R}^{0:od \times m}, Old,$  ... smoothed values  
 $scale \in \mathbf{R}$   
 $sing \in \mathbf{Z}, In, Out,$  ... singularity count  
 $tol \in \mathbf{R}$   
 $u \in \mathbf{R}^{m \times d}, Old(lm, d),$  ... query points  
 $w \in \mathbf{R}^{nf}, Old,$  ... workspace for regression weights  
 $work \in \mathbf{R}^{d2MAX}, Old$   
 $y \in \mathbf{R}^n, Old$   
 Include: kd routines lin  
 /fs/pyxis6/ehg/a/loess/l2fit.g  
 Wed May 29 14:30:59 1991

ehg139

```
s := l2tr(v,nvmax,nvert,n,d,nf,f,x,π,ψ,  
y,rw,trL,kernel,k,dist,φ,η,X,od,  
w,diagL,vval2,ncmax,vc,a,ξ,lo,hi,c,  
vhit,rcond,sing,dd,tdeg,cdeg,Lq,Lf,setLf)
```

... l2fit with trace(L)

Assert( $k \leq nf - 1$ , 104)

Assert( $k \leq d2MAX$ , 105)

if  $trL \neq 0$

$diagL := 0$

$vval2 := 0$

$\psi := Identity$

for  $1 \leq l \leq n_{vert}$

$q := v_{l,:}$

    ehg127( $q, n, d, nf, f, x, \psi, y, rw, kernel,$   
         $k, dist, \eta, X, od, w, rcond, sing, \Sigma, U,$   
         $V, \gamma, qraux, work, tol, dd, tdeg, cdeg, s_{:,l}$   
    )

if  $trL \neq 0$

    ... invert  $\psi$

$\phi := 0$

        for  $1 \leq i \leq nf$

$\phi_{\psi_i} := i$

$z := v_{l,:}$

    vleaf( $z, vhit_l, leaf, nleaf, d, n_{vert}, nvmax, ncmax, vc, a,$   
         $\xi, lo, hi, c, v$   
    )

for  $1 \leq ileaf \leq nleaf$

for  $lo_{leaf_{ileaf}} \leq ii \leq hi_{leaf_{ileaf}}$

$i := \phi_{\pi_{ii}}$

if  $i \neq 0$

    Assert( $\psi_i = \pi_{ii}$ , 194)

$\eta := 0$

$\eta_i := w_i$

    ...  $\eta = Q^T W e_i$

    sqrs1( $X, nf, nf, k, qraux, \eta, work, \eta, \eta, work,$   
         $work, 1000, info$   
    )

for  $1 \leq j \leq k$

$\gamma_j := \text{if}(\Sigma_j > tol, \frac{\langle U_{:,j}, \eta \rangle}{\Sigma_j}, \text{else}, 0.)$

```

    for 1 ≤ j ≤ d + 1
        vval2j-1,l := <Vj,: , γ>
    z := xπz,:
    term := eval(z, d, ncmax, vc, a, ξ, lo, hi, c, v,
        nvmax, vval2
    )
    diagLπz += term
    vval2:,l := 0
if setLf ... like l2fit; Lf_,l,: := Vgma + U TQ TW
Assert(k ≥ d + 1, 196)
Lql,: := ψ1:nf
Lf:,l,: := 0
for 1 ≤ j ≤ k
    η := 0
    η1:k := U:,j
    sqrrsl(X, nf, nf, k, qraux, η, η, work, work, work,
        work, 10000, info
    )
    if Σj > tol
        scale := 1./Σj
    else
        scale := 0.
    η *= scale · w
    for 1 ≤ i ≤ nf
        Lf:,l,i += V1:d+1,j · ηi
if trL ≠ 0
    trL := Sum(diagL)

```

---

$\Sigma \in \mathbf{R}^k, Old(d2MAX)$   
 $U \in \mathbf{R}^{k \times k}, Old(d2MAX, d2MAX), \dots$  upper triangular factor  
 $V \in \mathbf{R}^{k \times k}, Old(d2MAX, d2MAX)$   
 $X \in \mathbf{R}^{nf \times k}, Old$   
 $diagL \in \mathbf{R}^n, Old$   
 $dist \in \mathbf{R}^n, Old, \dots$  may overlay  $\phi$   
 $\eta \in \mathbf{R}^{nf}, Old$   
 $f \in \mathbf{R}, In$   
 $\gamma \in \mathbf{R}^k, Old(d2MAX), \dots \Sigma^+ U^T Q^T W y$   
 $i, ii, ileaf, info, j, k, l \in \mathbf{Z}$   
 $leaf \in \mathbf{Z}^{vcMAX}, Old$   
 $n_{vert} \in \mathbf{Z}, \dots$  number of vertices  
 $nf \in \mathbf{Z}, \dots$  number of "near" neighbors  
 $nleaf \in \mathbf{Z}$   
 $nvmax \in \mathbf{Z}, \dots$  allocated size of v

$od \in \mathbf{Z}$ , ... 0 means caller wants values only  
 $\phi \in \mathbf{Z}^n, \text{Permutation}, \text{Old}$ , ... may overlay *dist*  
 $q \in \mathbf{R}^d, \text{Old}(dMAX), \text{In}$ , ... query point  
 $qaux \in \mathbf{R}^{d2MAX}, \text{Old}$   
 $rcond \in \mathbf{R}, \text{In}, \text{Out}$ , ... reciprocal condition number  
 $s \in \mathbf{R}^{0:od \times n_{\text{vert}}}, \text{Old}$ , ... smoothed values  
 $scale \in \mathbf{R}$   
 $sing \in \mathbf{Z}, \text{In}, \text{Out}$   
 $term \in \mathbf{R}$ , ... contribution to diag L  
 $tol \in \mathbf{R}$   
 $vval2 \in \mathbf{R}^{0:d \times n_{\text{vert}}}, \text{Old}$   
 $w \in \mathbf{R}^{n^f}, \text{Old}$ , ... workspace for regression weights  
 $work \in \mathbf{R}^{d2MAX}, \text{Old}$   
 $y \in \mathbf{R}^n, \text{Old}$   
 $z \in \mathbf{R}^d, \text{Old}(dMAX), dMAX$   
Include: kd lin routines  
/u3/ehg/a/loess/l2tr.g  
Sat Mar 17 13:45:23 1990

lofort(*iunit*,*iv*,*liv*,*lv*,*wv*)

ehg170(*iunit*,*iv<sub>D</sub>*,*iv<sub>VC</sub>*,*iv<sub>NV</sub>*,*iv<sub>NVMAX</sub>*,*iv<sub>NC</sub>*,*iv<sub>NCMAX</sub>*,*iv<sub>ivA1</sub>*,*iv<sub>ivC1</sub>*,*iv<sub>ivH1</sub>*,  
*iv<sub>ivL01</sub>*,*wv<sub>ivv1</sub>*,*wv<sub>ivvv1</sub>*,*wv<sub>ivg1</sub>*  
)

---

*iunit* ∈ **Z**, *In*, ... Fortran unit number for generated Fortran

*iv* ∈ **Z**, *Old*

*wv* ∈ **R**, *Old*

Include: kd routines *iv* approx lin

/u3/ehg/a/loess/lofort.g

Sun Jun 12 10:39:27 1988



lread(*iunit,d,vc,nc,nv,iv,liv,lv,v*)

*ivSEQ* := 173

*ivD* := *d*

*ivVC* := *vc*

*ivNVMAX* := *nv*

*ivNCMAX* := *nc*

*ivA1* := 50

*ivC1* := *ivA1* + *nc*

*ivH1* := *ivC1* + *vc* · *nc*

*ivLO1* := *ivH1* + *nc*

*bound* := *ivLO1* + *nc*

Assert(*bound* − 1 ≤ *liv*, 102)

*ivV1* := 50

*ivVV1* := *ivV1* + *nv* · *d*

*ivΞ1* := *ivVV1* + (*d* + 1) · *nv*

*bound* := *ivΞ1* + *nc*

Assert(*bound* − 1 ≤ *lv*, 103)

ehg168(*iunit,d,vc,nc,nv,nv,v<sub>ivV1</sub>,iv<sub>ivA1</sub>,v<sub>ivΞ1</sub>,v<sub>ivVV1</sub>*)

ehg169(*d,vc,nc,nc,nv,nv,v<sub>ivV1</sub>,iv<sub>ivA1</sub>,v<sub>ivΞ1</sub>,iv<sub>ivC1</sub>,*

*iv<sub>ivH1</sub>,iv<sub>ivLO1</sub>*

)

---

*bound* ∈ **Z**

*d* ∈ **Z**, *In*

*iunit* ∈ **Z**, *In*, ... Fortran unit to read from

*iv* ∈ **Z**<sup>*liv*</sup>, *Old*, *Out*

*liv* ∈ **Z**, *In*

*lv* ∈ **Z**, *In*

*nc* ∈ **Z**, *In*

*nv* ∈ **Z**, *In*

*v* ∈ **R**<sup>*lv*</sup>, *Old*, *Out*

*vc* ∈ **Z**, *In*

Include: *iv* routines

/fs/pyxis6/ehg/a/loess/lread.g

Thu Sep 15 23:10:08 1988

losave(*iunit*,*iv*,*liv*,*lv*,*v*)

ehg167(*iunit*,*iv<sub>D</sub>*,*iv<sub>VC</sub>*,*iv<sub>NC</sub>*,*iv<sub>NV</sub>*,*iv<sub>NVMAX</sub>*,*v<sub>iv<sub>v1</sub></sub>*,*iv<sub>iv<sub>A1</sub></sub>*,*v<sub>iv<sub>E1</sub></sub>*,*v<sub>iv<sub>W1</sub></sub>*)

---

*iunit* ∈  $\mathbf{Z}$ , *In*, ... Fortran unit to write on

*iv* ∈  $\mathbf{Z}^{liv}$ , *Old*, *In*

*liv* ∈  $\mathbf{Z}$ , *In*

*lv* ∈  $\mathbf{Z}$ , *In*

*v* ∈  $\mathbf{R}^{lv}$ , *Old*, *In*

Include: iv

/u3/ehg/a/loess/losave.g

Sun Jun 12 09:51:48 1988

**lowesa(*trl,n,d,τ,nsing,δ<sub>1</sub>,δ<sub>2</sub>*)**

**ehg141(*trl,n,1,τ,d,nsing,dka,d1a,d2a*)**

**ehg141(*trl,n,2,τ,d,nsing,dkb,d1b,d2b*)**

$$\alpha := \frac{\tau - dka}{dkb - dka}$$

$$\delta_1 := (1 - \alpha) \cdot d1a + \alpha \cdot d1b$$

$$\delta_2 := (1 - \alpha) \cdot d2a + \alpha \cdot d2b$$

---

**α ∈ ℝ**

**d ∈ ℤ, In**

**d1a, d1b, d2a, d2b ∈ ℝ**

**δ<sub>1</sub> ∈ ℝ, Out**

**δ<sub>2</sub> ∈ ℝ, Out**

**dka, dkb ∈ ℤ**

**n ∈ ℤ, In**

**nsing ∈ ℤ, In**

**τ ∈ ℤ, In, ... degrees of freedom in local model**

**trl ∈ ℝ, In**

**Include: iv routines**

**/fs/pyxis6/ehg/a/loess/lowesa.g**

**Wed Jun 5 02:26:44 1991**

lowesb(xx,yy,ww,diagL,infl,iv,liv,lv,wv)

Assert( $iv_{SEQ} \neq 173$  and  $iv_{SEQ} \neq 174$ , 174)

if  $iv_{SEQ} \neq 172$

    Assert( $iv_{SEQ} = 171, 171$ )

$iv_{SEQ} := 173$

$trL := \text{if}(infl, 1., \text{else}, 0.)$

$setLf := iv_{\Psi 1} \neq iv_{LQ}$

ehg131(xx,yy,ww,trL,diagL, $iv_{KERNEL}$ , $iv_{DIM}$ , $iv_N$ , $iv_D$ , $iv_{NC}$ ,

$iv_{NCMAX}$ , $iv_{VC}$ , $iv_{NV}$ , $iv_{NVMAX}$ , $iv_{NF}$ , $wv_F$ , $iv_{i_{A1}}$ , $iv_{i_{C1}}$ , $iv_{i_{H1}}$ , $iv_{i_{L01}}$ ,

$iv_{i_{T11}}$ , $iv_{i_{\Psi 1}}$ , $wv_{i_{V1}}$ , $iv_{i_{VH}}$ , $wv_{i_{V1}}$ , $wv_{i_{B1}}$ , $wv_{i_{WORK1}}$ , $wv_{i_{WORK2}}$ , $wv_{i_{WORK3}}$ ,Floor( $iv_N \cdot wv_{FCCELL}$ ),

$wv_{FDIAM}$ , $wv_{i_{WORK4}}$ , $wv_{i_{V2}}$ , $wv_{RCOND}$ , $iv_{SING}$ , $iv_{NDIST}$ , $iv_{DEG}$ , $iv_{CDEG:CDEG+8}$ , $iv_{i_{LQ}}$ , $wv_{i_{LF}}$ ,

$setLf$

)

if  $iv_{NV} + iv_{VC}/2 > iv_{NVMAX}$

    ehg183("Warning. k-d tree limited by memory; nvmax=", $iv_{NVMAX}$ ,1,1)

else if  $iv_{NC} + 2 > iv_{NCMAX}$

    ehg183("Warning. k-d tree limited by memory. ncmax=", $iv_{NCMAX}$ ,1,1)

---

$diagL \in \mathbf{R}'$ , Old, Out

$infl$ : Logical, In

$iv \in \mathbf{Z}'$ , Old

$setLf$ : Logical, ... should Lq, Lf be filled in?

$wv \in \mathbf{R}'$ , Old

$ww \in \mathbf{R}'$ , Old

$xx \in \mathbf{R}'$ , Old, Matrix

$yy \in \mathbf{R}'$ , Old

Include: kd routines iv approx lin

/u3/ehg/a/loess/lowesb.g

Sat Mar 17 13:25:14 1990

lowesc( $n, L, LL, trL, \delta_1, \delta_2$ )

... compute  $LL = (I - L)(I - L)'$

  for  $1 \leq i \leq n$

$L_{i,i} -= 1$

  for  $1 \leq i \leq n$

    for  $1 \leq j \leq i$

$LL_{i,j} := \langle L_{i,:}, L_{j,:} \rangle$

  for  $1 \leq i \leq n$

    for  $i + 1 \leq j \leq n$

$LL_{i,j} := LL_{j,i}$

  for  $1 \leq i \leq n$

$L_{i,i} += 1$

... accumulate first two traces

$trL := 0$

$\delta_1 := 0$

  for  $1 \leq i \leq n$

$trL += L_{i,i}$

$\delta_1 += LL_{i,i}$

...  $\delta_2 = trLL^2$

$\delta_2 := 0$

  for  $1 \leq i \leq n$

$\delta_2 += \langle LL_{i,:}, LL_{:,i} \rangle$

---

$L \in \mathbf{R}^{n \times n}, Old, In$

$LL \in \mathbf{R}^{n \times n}, Old, Out$

$\delta_1 \in \mathbf{R}, Out, \quad \dots tr(I - L)(I - L)'$

$\delta_2 \in \mathbf{R}, Out, \quad \dots tr[(I - L)(I - L)']^2$

$i, j \in \mathbf{Z}$

$n \in \mathbf{Z}, In$

$trL \in \mathbf{R}, Out$

Include: lin

  /fs/pyxis6/ehg/a/loess/lowesc.g

Thu Oct 22 17:03:18 1987

lowesd(version,iv,liv,lv,v,d,n,f,ideg, <sup>iv,lv,d</sup>setLf)

Assert(version = <sup>iv</sup>105,100)

iv<sub>SEQ</sub> := 171

iv<sub>D</sub> := d

iv<sub>N</sub> := n

vc := 2<sup>d</sup>

iv<sub>VC</sub> := vc

Assert(f > 0, 120)

nf := Min(n, Floor(n·f))

iv<sub>NF</sub> := nf

iv<sub>KERNEL</sub> := 1

iv<sub>DIM</sub> := if(ideg = 0, 1, ideg = 1, d + 1, ideg = 2,  $\frac{(d+2) \cdot (d+1)}{2}$ )

iv<sub>KIND</sub> := 1

~~nvmax := Max(200, n)~~

iv<sub>NVMAX</sub> := nvmax

ncmax := ~~Max(200, n)~~ <sup>iv,lv,d</sup>

iv<sub>NCMAX</sub> := ncmax

iv<sub>SING</sub> := 0

iv<sub>DEG</sub> := ideg

Assert(ideg ≥ 0, 195)

Assert(ideg ≤ 2, 195)

iv<sub>NDIST</sub> := d

iv<sub>CDEG:CDEG+8</sub> := ideg

iv<sub>A1</sub> := 50

iv<sub>C1</sub> := iv<sub>A1</sub> + ncmax

iv<sub>H1</sub> := iv<sub>C1</sub> + vc·ncmax

iv<sub>LO1</sub> := iv<sub>H1</sub> + ncmax

iv<sub>Π1</sub> := iv<sub>LO1</sub> + ncmax

... initialize permutation

j := iv<sub>Π1</sub> - 1

for 1 ≤ i ≤ n

iv<sub>j+i</sub> := i

iv<sub>VH</sub> := iv<sub>Π1</sub> + n

iv<sub>LQ</sub> := iv<sub>VH</sub> + nvmax

if setLf

iv<sub>Ψ1</sub> := iv<sub>LQ</sub> + nvmax·nf

else

iv<sub>Ψ1</sub> := iv<sub>LQ</sub>

bound := iv<sub>Ψ1</sub> + n

Assert(bound - 1 ≤ liv, 102)

iv<sub>V1</sub> := 50

iv<sub>VV1</sub> := iv<sub>V1</sub> + nvmax·d

```
ivΞ1 := ivVV1 + (d + 1) · nvmax
ivWORK1 := ivΞ1 + ncmax
ivWORK2 := ivWORK1 + n
ivWORK3 := ivWORK2 + nf
ivVV2 := ivWORK3 + ivDIM · nf
ivLF := ivVV2 + (d + 1) · nvmax
if setLf
    ivWORK4 := ivLF + (d + 1) · nvmax · nf
else
    ivWORK4 := ivLF
bound := ivWORK4 + nf
Assert(bound - 1 ≤ lv, 103)
vF := f
vFCELL := 0.05
vFDIAM := 0.
vRCOND := 1.



---


bound, d ∈ Z
f ∈ R
i ∈ Z
ideg ∈ Z, ln
iv ∈ Zliv, Old
j, liv, lv, n ∈ Z
ncmax ∈ Z, ... maximum number of cells
nf ∈ Z
nvmax ∈ Z, ... maximum number of vertices
setLf: Logical, ln
v ∈ Rlv, Old
vc, version ∈ Z
Include: iv routines
    /fs/pyxis6/ehg/a/loess/lowesd.g
Wed May 29 14:00:17 1991
```

$s := \text{lowese}(iv, liv, lv, wv, m, z)$

$\text{Assert}(iv_{SEQ} \neq 172, 172)$

$\text{Assert}(iv_{SEQ} = 173, 173)$

$\text{ehg133}(iv_N, iv_D, iv_{VC}, iv_{NMAX}, iv_{NC}, iv_{NCMAX}, iv_{iv_{A1}}, iv_{iv_{C1}}, iv_{iv_{H1}}, iv_{iv_{LO1}},$   
 $wv_{iv_{v1}}, wv_{iv_{w1}}, wv_{iv_{\Xi 1}}, m, z, s$   
)

---

$iv \in \mathbf{Z}', Old$

$m \in \mathbf{Z}$

$s \in \mathbf{R}^m, Old$

$wv \in \mathbf{R}', Old$

$z \in \mathbf{R}^{m \times 1}, Old$

Include: kd routines iv approx lin

/fs/pyxis6/ehg/a/loess/lowese.g

Wed May 29 14:01:53 1991



$$s := \text{lowesf}(xx, yy, ww, iv, liv, lv, wv, m, z, L, \text{ihat})$$

**Assert( $171 \leq iv_{SEQ}$  and  $iv_{SEQ} \leq 174, 171$ )**

$$iv_{SEQ} := 172$$
$$\text{Assert}(iv_{NVMAX} \geq iv_{NF}, 186)$$

```

S := 12fit(z,m,m,iv_N,iv_D,iv_NF,ww_F,xx,iv_ivIII,yy,
ww,iv_KERNEL,iv_DIM,ww_ivWORK1,ww_ivWORK2,ww_ivWORK3,0,L,ihat,ww_ivWORK4,
ww_RCOND,iv_SING,iv_NDIST,iv_DEG,iv_CDEG:CDEG+8
)

```

$$L \in \mathbf{R}^{m \times n}, Old(m, \cdot)$$
$$i\hat{a}t \in \mathbb{Z}$$
 $iv \in \mathbf{Z}^+, Old$ 
$$m \in \mathbb{Z}$$
 $s \in \mathbf{R}^m, Old$  $wv \in \mathbf{R}', Old$  $ww \in \mathbf{R}', Old$  $xx \in \mathbf{R}^+, Old, Matrix$  $yy \in \mathbf{R}', Old$ 
$$\mathbf{z} \in \mathbf{R}^{m \times 1}, Old$$

```
Include: kd routines iv approx lin
```

```
/fs/pyxis6/ehg/a/loess/lowesf.g
```

Mon May 27 22:15:07 1991

lowes1(*iv*,*liv*,*lv*,*wv*,*m*,*z*,*L*)

Assert(*iv*<sub>SEQ</sub> ≠ 172, 172)

Assert(*iv*<sub>SEQ</sub> = 173, 173)

Assert(*iv*<sub>WORK4</sub> ≠ *iv*<sub>LF</sub>, 175)

ehg191(*m*,*z*,*L*,*iv*<sub>D</sub>,*iv*<sub>N</sub>,*iv*<sub>NF</sub>,*iv*<sub>NV</sub>,*iv*<sub>NCMAX</sub>,*iv*<sub>VC</sub>,*iv*<sub>iv<sub>A1</sub></sub>,

*wv*<sub>iv<sub>B1</sub></sub>,*iv*<sub>iv<sub>LO1</sub></sub>,*iv*<sub>iv<sub>HN</sub></sub>,*iv*<sub>iv<sub>C1</sub></sub>,*wv*<sub>iv<sub>V1</sub></sub>,*iv*<sub>NVMAX</sub>,*wv*<sub>iv<sub>W2</sub></sub>,*wv*<sub>iv<sub>LF</sub></sub>,*iv*<sub>iv<sub>LQ</sub></sub>

)

---

$L \in \mathbf{R}^{m \times n}$ , *Old*(*m*, ·), *Out*

*iv* ∈  $\mathbf{Z}$ , *Old*

*m* ∈  $\mathbf{Z}$ , *In*

*wv* ∈  $\mathbf{R}$ , *Old*

*z* ∈  $\mathbf{R}^{m \times 1}$ , *Old*, *In*

Include: kd routines *iv*

/fs/pyxis6/ehg/a/loess/lowes1.g

Mon Jun 3 14:04:25 1991

lowesp( $n, y, \hat{y}, pwgts, rwgts, \pi, \tilde{y}$ )

... median absolute deviation

$$\tilde{y} := |y - \hat{y}| \cdot \sqrt{pwgts}$$

$$\pi := Identity$$

$$m := \text{Floor}(n/2) + 1$$

$$\text{ehg106}(1, n, m, 1, \tilde{y}, \pi, n)$$

if  $m > n - m + 1$

$$\text{ehg106}(1, m - 1, m - 1, 1, \tilde{y}, \pi, n)$$

$$mad := \frac{\tilde{y}_{\pi_{m-1}} + \tilde{y}_{\pi_m}}{2}$$

else

$$mad := \tilde{y}_{\pi_m}$$

... magic constant

$$c := \frac{(6 \cdot mad)^2}{5}$$

$$\tilde{y} := 1 - \frac{(y - \hat{y})^2 \cdot pwgts}{c}$$

$$\tilde{y} * = \sqrt{rwgts}$$

$$c := n / \text{Sum}(\tilde{y})$$

... pseudovalues

$$\tilde{y} := \hat{y} + (c \cdot rwgts) \cdot (y - \hat{y})$$

---

$c \in \mathbf{R}$

$m \in \mathbf{Z}$

$mad \in \mathbf{R}$

$n \in \mathbf{Z}, In$

$\pi \in \mathbf{Z}^n, Permutation, Old$

$pwgts \in \mathbf{R}^n, Old, In$

$rwgts \in \mathbf{R}^n, Old, In$

$y \in \mathbf{R}^n, Old, In$

$\hat{y} \in \mathbf{R}^n, Old, In$

$\tilde{y} \in \mathbf{R}^n, Old, Out$

Include: lin

/fs/pyxis6/ehg/a/loess/lowesp.g

Tue May 29 15:33:26 1990

lowesr(y,iv,liv,lv,wv)

Assert(iv<sub>SEQ</sub>≠172,172)

Assert(iv<sub>SEQ</sub> = 173,173)

ehg192(y,iv<sub>D</sub>,iv<sub>N</sub>,iv<sub>NF</sub>,iv<sub>NV</sub>,iv<sub>NVMAX</sub>,wv<sub>iv<sub>w1</sub></sub>,wv<sub>iv<sub>LF</sub></sub>,iv<sub>iv<sub>LQ</sub></sub>)

---

iv∈**Z**',Old,In

wv∈**R**',Old,In

Include: kd iv

/u3/ehg/a/loess/lowesr.g

Tue Apr 3 21:31:13 1990

lowesw(*res*,*n*,*rw*, $\pi$ )

... tranliterated from Devlin's ratfor

... find median of absolute residuals

$rw := |res|$

$\pi := Identity$

$nh := \text{Floor}(n/2) + 1$

... partial sort to find 6\*mad

ehg106(1,*n*,*nh*,1,*rw*, $\pi$ ,*n*)

if  $nh > n - nh + 1$

ehg106(1,*nh* - 1,*nh* - 1,1,*rw*, $\pi$ ,*n*)

$cmad := 3 \cdot (rw_{\pi_{nh}} + rw_{\pi_{nh-1}})$

else

$cmad := 6 \cdot rw_{\pi_{nh}}$

*rsmall* := rlmach(1)

if  $cmad < rsmall$

$rw := 1$

else

for  $1 \leq i \leq n$

if  $rw_i > cmad \cdot 0.999$

$rw_i := 0$

else if  $rw_i > cmad \cdot 0.001$

$rw_i := (1 - (rw_i / cmad)^2)^2$

else

$rw_i := 1$

---

$cmad \in \mathbf{R}$

$i, n, nh \in \mathbf{Z}$

$\pi \in \mathbf{Z}^n, \text{Permutation}, \text{Old}$

$res \in \mathbf{R}^n, \text{Old}$

*rsmall*  $\in \mathbf{R}$

$rw \in \mathbf{R}^n, \text{Old}$

Include: lin

/fs/pyxis6/ehg/a/loess/lowesw.g

Wed May 29 14:24:29 1991

ehg124

```
rbuila(ll,uu,d,n,nvert,ncell,ncmax,vc,x,π,  
      a,ξ,lo,hi,c,v,vhit,nvmax,fcell,fdiam,  
      dd)
```

```
p := 1  
l := ll  
u := uu  
lop := l  
hip := u  
while p ≤ ncell  
  diag := vcw,p,1:dd - vc1,p,1:dd  
  diam := || diag ||2  
  leaf := (u - l + 1 ≤ fcell or diam ≤ fdiam) or (ncell + 2 > ncmax or nvert + vc/2 > nvmax)  
  if !leaf  
    σ := spread(l,u,dd,x,π,n)  
    k := iMax(σ)  
    m := Floor( $\frac{l+u}{2}$ )  
    PartialSort(l,u,m,x1:k,π)  
    ... all ties go with hi son  
    while m > 1 and xπm-1,k = xπm,k  
      m -= 1  
    leaf := vc1,p,k = xπm,k or vcw,p,k = xπm,k  
  if leaf  
    ap := 0  
  else  
    ap := k  
    ξp := xπm,k  
    ... left son  
    ncell += 1  
    lop := ncell  
    loncell := l  
    hincell := m  
    ... right son  
    ncell += 1  
    hip := ncell  
    loncell := m + 1  
    hincell := u  
  cpvert(p,nvert,v,vhit,nvmax,d,k,ξp,2k-1,2d-k,  
        c1:p,c1:lop,c1:hip  
  )
```

$p += 1$   
 $l := lo_p$   
 $u := hi_p$

---

cpvert≡ehg125  
 $diag \in \mathbf{R}^{dd}, Old(dMAX)$   
 $diam \in \mathbf{R}$   
 $k \in \mathbf{Z}$   
 $l \in \mathbf{N}$   
*leaf*: Logical  
 $ll \in \mathbf{Z}$   
 $m \in \mathbf{N}$   
 $p \in \mathbf{Z}$ , ... current cell; root for points l to u  
 $\sigma \in \mathbf{R}^{dd}, Old(dMAX)$   
spread≡ehg129  
 $u \in \mathbf{N}$   
 $uu \in \mathbf{Z}$   
Include: kd routines approx lin  
/u3/ehg/a/loess/rbuild.g  
Thu Jan 25 16:36:25 1990

ehg129

$\sigma := \text{spread}(l, u, d, x, \pi, n)$

for  $1 \leq k \leq d$

$\alpha := \infty$

$\beta := -\infty$

for  $l \leq i \leq u$

$t := x_{\pi_i, k}$

$\alpha := \text{Min}(\alpha, x_{\pi_i, k})$

$\beta := \text{Max}(\beta, t)$

$\sigma_k := \beta - \alpha$

---

$\alpha, \beta \in \mathbf{R}$

$i, k, l \in \mathbf{Z}$

$\sigma \in \mathbf{R}^d, Old$

$t \in \mathbf{R}$

$u \in \mathbf{Z}$

Include: kd lin

/u3/ehg/a/loess/spread.g

Mon Mar 23 12:29:45 1987



ehg137

$vleaf(z, \kappa, leaf, nleaf, d, n_{vert}, nvmax, ncmax, vc, a,$   
 $\xi, lo, hi, c, v)$

... find leaf cells affected by  $z$

$stacktop := 0$

$p := 1$

$nleaf := 0$

**while**  $p > 0$

**if**  $a_p = 0$  ... leaf

$nleaf += 1$

$leaf_{nleaf} := p$

$p := Pop$

**else if**  $z_{a_p} = \xi_p$

        Push( $hi_p$ )

$p := lo_p$

**else if**  $z_{a_p} < \xi_p$

$p := lo_p$

**else**

$p := hi_p$

Assert( $nleaf \leq vcMAX, 185$ )

---

$STACKMAX \rightarrow 20$

Push( $\%?, \%mp$ )  $\rightarrow \{ stacktop += 1, Assert(stacktop \leq STACKMAX, 187), pstack_{stacktop} := \%mp \}$

$\%? := \%mp := Pop \rightarrow \{ \quad \quad \quad \text{bold} \quad \quad \quad \text{if}$

$(stacktop \geq 1, \%mp := pstack_{stacktop}, \text{else}, \%mp := 0), stacktop := Max(0, stacktop - 1) \}$

$leaf \in \mathbf{Z}^{vcMAX}, Old,$  ... indices of leaf cells

$nleaf \in \mathbf{Z},$  ... number of leaf cells found

$p \in \mathbf{Z},$  ... cell under consideration

$stacktop \in \mathbf{Z},$  ... index of top element in stack

$z \in \mathbf{R}^d, Old,$  ... vertex

Include: kd routines

/u3/ehg/a/loess/vleaf.g

Mon Dec 7 09:30:35 1987