

ALGORITHM 74

CURVE FITTING WITH CONSTRAINTS

J. E. L. PECK,

University of Alberta, Calgary, Alberta, Canada

procedure Curve fitting (k,a,b,m,x,y,w,n,alpha,beta,s,sgmsq,x0, gamma,c,z,r);

comment This procedure finds, by the method of least squares, the polynomial of degree n , $k \leq n < k+m$, whose graph contains $(a_1, b_1), \dots, (a_k, b_k)$ and approximates $(x_1, y_1), \dots, (x_m, y_m)$, where w_i is the weight attached to the point (x_i, y_i) . The details will be found in the reference cited below, where a similar notation is used. A nonlocal label "error" is assumed;
value a, x, y, w; **integer** k, m, n, r; **real** x0, gamma; **array** a, b, x, y, w, alpha, beta, s, sgmsq, c, z;
begin integer i, j; **array** w[1:k]; **real** p, f, lambda;
comment We shall first define several procedures to be used in the main program, which begins at the label START;

procedure Evaluate (x, nu);

comment This procedure evaluates $f = s_0p_0 + s_1p_1 + \dots + s_\nu p_\nu$, where $p_{-1}(x) = 0$, $p_0(x) = 1$, $\beta_0 = 0$ and $p_{i+1}(x) = (x - \alpha_i)p_i(x) - \beta_i p_{i-1}(x)$, $i = 0, 1, \dots, \nu-1$. The value of $p_\nu(x)$ remains in p;

real x; **integer** nu;
begin real p0, temp; **integer** i; p0 := 0; p := 1; f := s[0];
for i := 0 **step** 1 **until** nu-1 **do**
 begin temp := p;
 p := (x-alpha[i]) × p - beta[i] × p0;
 p0 := temp; f := f + p × s[i+1] **end** i
end Evaluate;

procedure Coda (n, c);

comment This procedure finds the c's when $c_0 + c_1x + \dots + c_nx^n = s_0p_0(x) + \dots + s_n p_n(x)$;

integer n; **array** c;
begin integer i, r; **real** t1, t2; **array** pm, p[0:n];
for r := 1 **step** 1 **until** n **do**
 c[r] := pm[r] := p[r] := 0;
 pm[0] := 0; p[0] := 1; c[0] := s[0];
for i := 0 **step** 1 **until** n-1 **do**
 begin t2 := 0;
 for r := 0 **step** 1 **until** i+1 **do**
 begin t1 := (t2-alpha[i]) × p[r]-beta[i] × pm[r])/lambda;
 t2 := pm[r] := p[r]; p[r] := t1;
 c[r] := c[r] + t1 × s[i+1] **end** r
 end i
end Coda;

procedure GEFYT (n,n0,x,y,w,m);

comment This is the heart of the main program. It computes the $\alpha_i, \beta_i, s_i, \sigma_i^2$, using the method of orthogonal polynomials, as described in the reference;

integer n,n0,m; **array** x,y,w;
begin real dsq,wpp,wpp0,wxpp,wyp,temp;
integer i,j,freedom; **array** p,p0[1:m]; **boolean** exact;
if n-n0 > m \vee n < n0 **then go to** error;
 beta[n0] := dsq := wpp := 0; exact := n-n0 ≥ m-1;
for j := 1 **step** 1 **until** m **do**
 begin p[j] := 1; p0[j] := 0; wpp := wpp + w[j];
 if \neg exact **then** dsq := dsq + w[j] × y[j] × y[j] **end** initialise;

for i := n0 **step** 1 **until** n **do**

begin freedom := m-1-(i-n0); wyp := wxpp := 0;

for j := 1 **step** 1 **until** m **do**

begin temp := w[j] × p[j];

if i < n **then** wxpp := wxpp + temp × x[j] × p[j];

if freedom ≥ 0 **then** wyp := wyp + temp × y[j] **end** j;

if freedom ≥ 0 **then** s[i] := wyp/wpp;

if \neg exact **then begin** dsq := dsq - s[i] × s[i] × wpp;

 sgmsq[i] := dsq/freedom **end** if;

if i < n **then begin** alpha[i] := wxpp/wpp; wpp0 := wpp;

 wpp := 0;

for j := 1 **step** 1 **until** m **do**

begin temp := (x[j]-alpha[i]) × p[j] - beta[i] × p0[j];

 wpp := wpp + w[j] × temp × temp;

 p0[j] := p[j]; p[j] := temp **end** j;

 beta[i+1] := wpp/wpp0 **end** if

end i

end GEFYT;

 START: **for** j := 1 **step** 1 **until** k **do**

begin w1[j] := 1; a[j] = (a[j]-x0)/gamma **end** j;

 GEFYT (k,0,a,b,w1,k);

comment This finds the polynomial of degree k-1 whose graph contains $(a_1, b_1), \dots, (a_k, b_k)$ supplying the α_i, β_i, s_i , $0 \leq i \leq k$;

begin real rho; rho := 0;

for j := 1 **step** 1 **until** m **do**

begin rho := rho + w[j];

 x[j] := (x[j] - x0)/gamma **end** j; rho := m/rho;

comment The factor ρ is used to normalize the weights. We shall now put $s_k = 0$ in order to evaluate $p_k(x)$ and the polynomial of degree k-1 simultaneously;

 s[k] := 0;

for j := 1 **step** 1 **until** m **do**

begin Evaluate (x[j],k);

if p = 0 **then go to** error;

 y[j] := (y[j] - f)/p;

 w[j] := w[j] × p × p × rho **end** j

end rho;

comment We have now normalized the weights and adjusted the weights and ordinates ready for the least squares approximation;

 GEFYT (n,k,x,y,w,m);

comment The coefficients α_i, β_i , $0 \leq i < n$, and s_i , $0 \leq i \leq n$ are now ready. The polynomial may be evaluated for $x = z_1, z_2, \dots, z_r$, but the variable must be adjusted first. Note that we may evaluate the best polynomial of lower degree by decreasing n;

begin real x;

for j := 1 **step** 1 **until** r **do**

begin x := (z[j]-x0)/gamma;

 Evaluate (x,n); **comment** the values of z_j and f should now be printed; **end** j;

comment We may now adjust the coefficients for scale and then find the coefficients of the power series $c_0 + c_1x + \dots + c_nx^n = s_0p_0(x) + \dots + s_n p_n(x)$;

for i := 0 **step** 1 **until** n-1 **do**

begin alpha[i] := alpha[i] × gamma + x0;

 beta[i] := beta[i] × gamma **end** i; lambda := gamma;

 Coda (n,c);

comment We may now re-evaluate the polynomial from the power series;

for j := 1 **step** 1 **until** r **do**

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begin x := z[j]; f := c[n];
for i := n-1 step -1 until 0 do
  f := f × x + c[i];
comment the values of x and f should now be printed; end j
end x
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end Curve fitting

REFERENCE: PECK, J. E. L. Polynomial curve fitting with constraint, *Soc. Indust. Appl. Math. Rev.* (1961).

CERTIFICATION OF ALGORITHM 74
CURVE FITTING WITH CONSTRAINTS [J. F.
Peck, *Comm. ACM*, Jan. 62]

KAZUO ISODA
Japan Atomic Energy Research Institute, Tokai, Ibaraki,
Japan

Algorithm 74 was hand-compiled into SOAP IIa for the IBM 650 and run successfully with no corrections except the case in which the origin (0, 0) are given as both a constraint and a sample.