

THE ALGORITHM

1. Given $\mathbf{x}_f^{(1)} = \mathbf{x}_c^*$, $\lambda^{(1)} = 1$, $\delta^{(1)}$, α , $\mathbf{J}_f^{(1)} = \mathbf{J}_c^*$ and $i=1$.

2. Construct $V^{(i)}$.

3. Apply the optimization procedure

$$[\mathbf{B}^{(i)}, \mathbf{s}^{(i)}, \mathbf{t}^{(i)}, \sigma^{(i)}, \mathbf{c}^{(i)}, \gamma^{(i)}] = \arg \left\{ \min_{\mathbf{B}, \mathbf{s}, \mathbf{t}, \sigma, \mathbf{c}, \gamma} \left\| \begin{bmatrix} \mathbf{e}_1^T & \mathbf{e}_2^T & \cdots & \mathbf{e}_N^T \end{bmatrix}^T \right\| \right\}$$

$$\mathbf{e}_p = \mathbf{R}_c(\mathbf{P}^{(i)}(\mathbf{x}_f^{(j)}, \psi_k), \mathbf{P}_\psi^{(i)}(\mathbf{x}_f^{(j)}, \psi_k)) - \mathbf{R}_f(\mathbf{x}_f^{(j)}, \psi_k) \quad \forall \mathbf{x}_f^{(j)} \in V^{(i)}, \quad \forall \psi_k, k=1, 2, \dots, N_\psi, N=N_p N_\psi$$

to obtain the mapping parameters.

4. Construct the surrogate model

$$\mathbf{R}_s^{(i)}(\mathbf{x}_f) = \lambda^{(i)} \mathbf{R}_m^{(i)}(\mathbf{x}_f) + (1 - \lambda^{(i)}) (\mathbf{R}_f(\mathbf{x}_f^{(i)}) + \mathbf{J}_f^{(i)} \Delta \mathbf{x}_f), \quad \lambda^{(i)} \in [0, 1]$$

where $\mathbf{R}_f(\mathbf{x}_f, \psi_j) \approx \mathbf{R}_m^{(i)}(\mathbf{x}_f, \psi_j) = \mathbf{R}_c(\mathbf{P}^{(i)}(\mathbf{x}_f, \psi_j), \mathbf{P}_\psi^{(i)}(\mathbf{x}_f, \psi_j)), j=1, 2, \dots, N_\psi$

and

$$\begin{bmatrix} \mathbf{P}^{(i)}(\mathbf{x}_f, \psi_j) \\ \mathbf{P}_\psi^{(i)}(\mathbf{x}_f, \psi_j) \end{bmatrix} = \begin{bmatrix} \mathbf{B}^{(i)} & \mathbf{s}^{(i)} \\ \mathbf{t}^{(i)T} & \sigma^{(i)} \end{bmatrix} \begin{bmatrix} \Delta \mathbf{x}_f \\ \psi_j \end{bmatrix} + \begin{bmatrix} \mathbf{c}^{(i)} \\ \gamma^{(i)} \end{bmatrix}$$

5. Obtain the suggested step $\mathbf{h}^{(i)}$ by solving

$$\mathbf{h}^{(i)} = \arg \left\{ \min_{\mathbf{h}^{(i)}} U(\mathbf{R}_s^{(i)}(\mathbf{x}_f^{(i)} + \mathbf{h}^{(i)})) \right\}, \quad \|\mathbf{h}^{(i)}\| \leq \delta^{(i)}$$

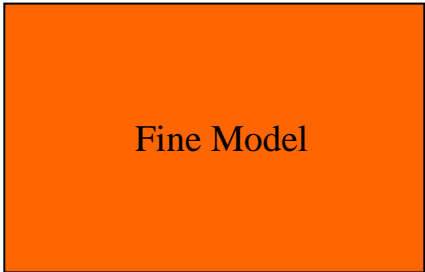
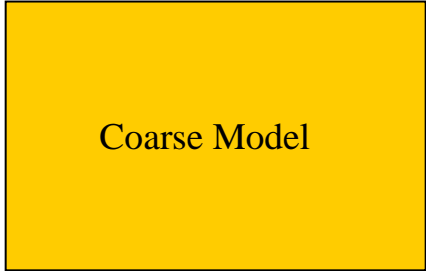
6. If $U(\mathbf{R}_f(\mathbf{x}_f^{(i)} + \mathbf{h}^{(i)})) < U(\mathbf{R}_f(\mathbf{x}_f^{(i)}))$, set $\mathbf{x}_f^{(i+1)} = \mathbf{x}_f^{(i)} + \mathbf{h}^{(i)}$ else $\mathbf{x}_f^{(i+1)} = \mathbf{x}_f^{(i)}$.

7. Update $\mathbf{J}_f^{(i)}$, $\delta^{(i)}$ and $\lambda^{(i)}$.

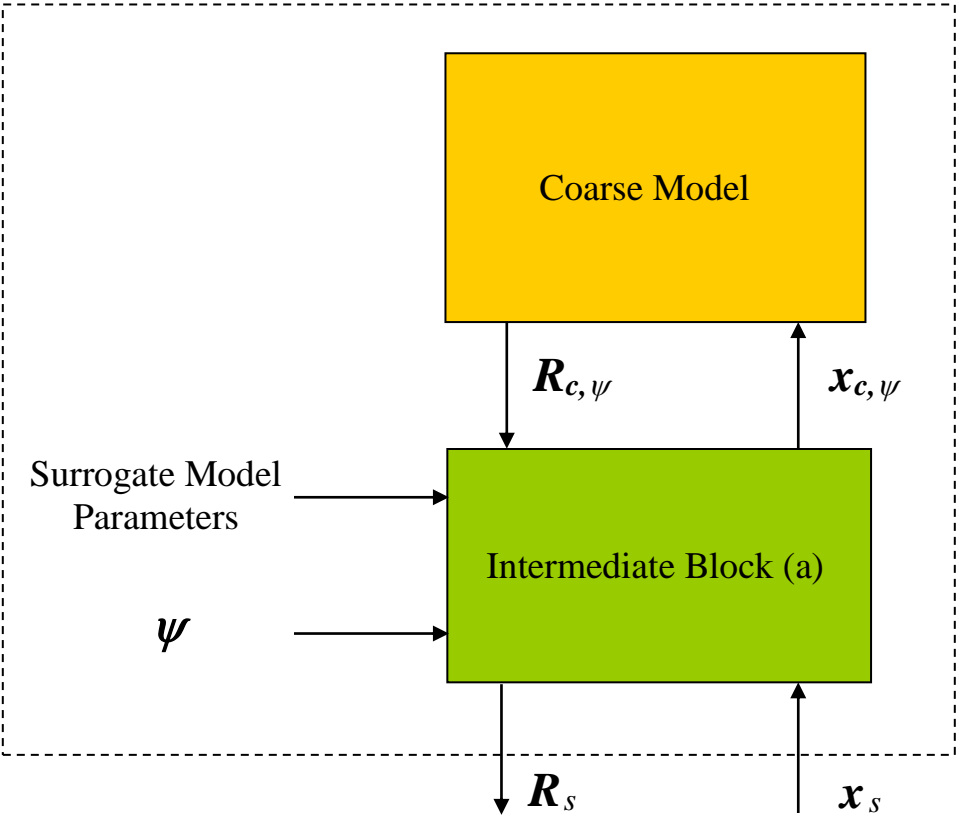
8. If the stopping criterion is satisfied stop.

9. Set $i=i+1$ and go to step 2.

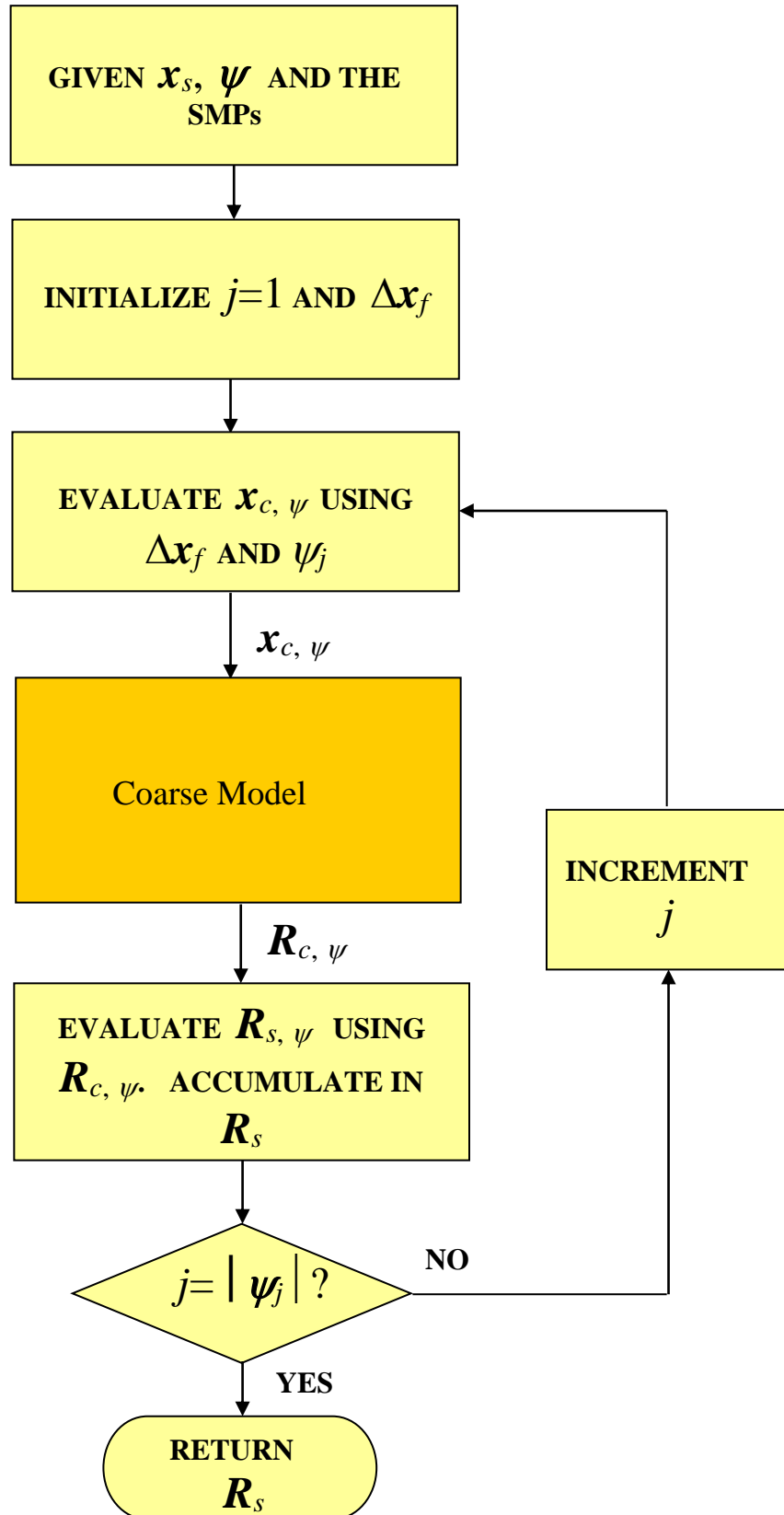
COARSE AND FINE MODELS



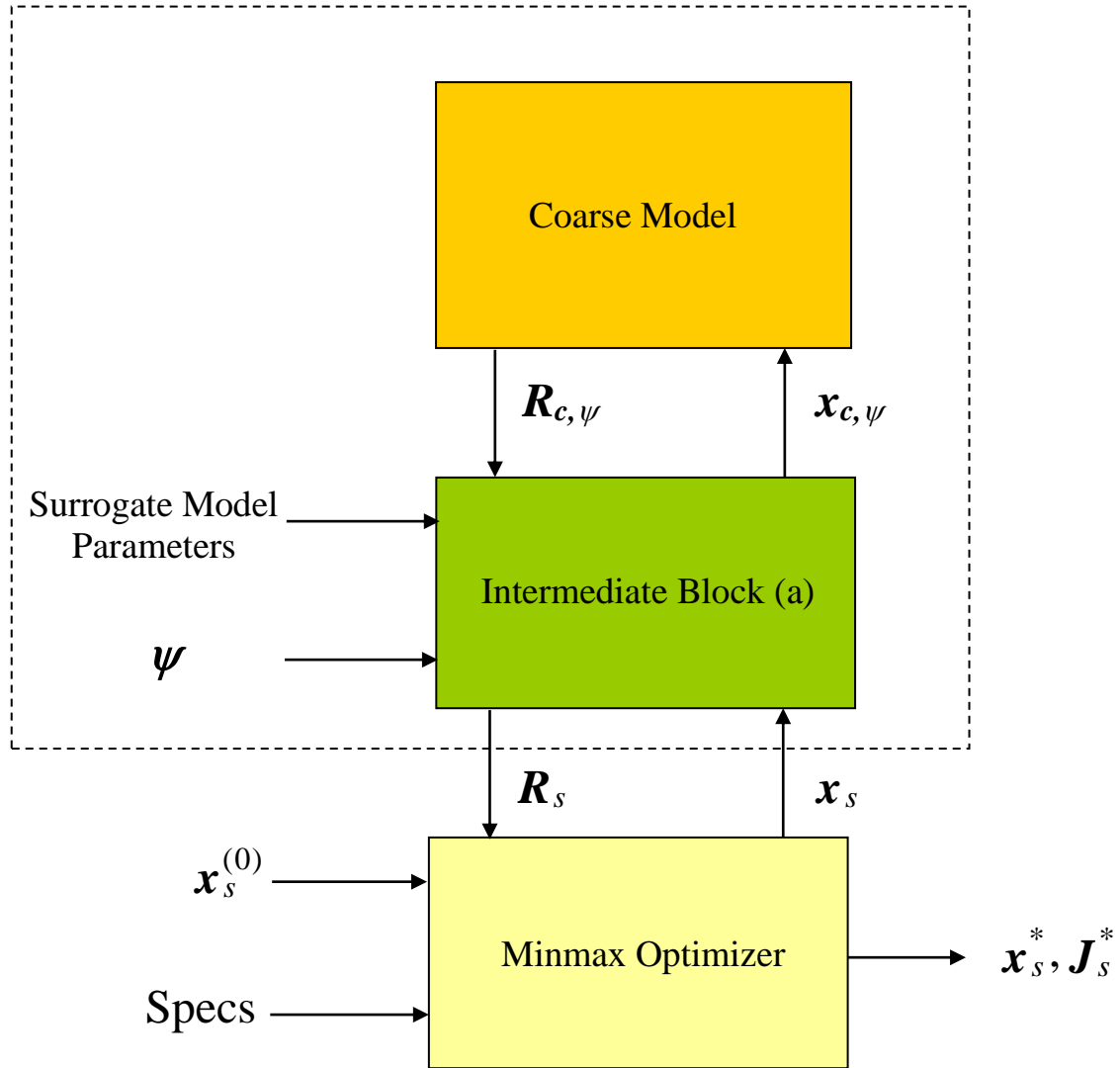
THE SURROGATE MODEL



INTERMEDIATE BLOCK (a)



MINMAX OPTIMIZATION OF THE SURROGATE MODEL



CASE STUDY (a)

The coarse model is given by

$$\mathbf{R}_c(\mathbf{x}_c, p) = 100p(x_{c2} - x_{c1}^2)^2 + p^2(1 - x_{c1})^2 + 5$$

The fine model is given by

$$\mathbf{R}_f(\mathbf{x}_f, p_f) = \mathbf{R}_c(\mathbf{x}_c, p_c)$$

where

$$\begin{bmatrix} \mathbf{x}_c \\ p_c \end{bmatrix} = \begin{bmatrix} \mathbf{B} & \mathbf{s} \\ \mathbf{t} & \sigma \end{bmatrix} \begin{bmatrix} \Delta \mathbf{x}_f \\ p_f \end{bmatrix} + \begin{bmatrix} \mathbf{c} \\ \gamma \end{bmatrix},$$

and

$$\mathbf{B} = \begin{bmatrix} 1.1 & -0.2 \\ 0.2 & 0.9 \end{bmatrix}, \quad \mathbf{s} = \mathbf{t} = \begin{bmatrix} 0.01 \\ 0.01 \end{bmatrix}, \quad \mathbf{c} = \begin{bmatrix} -0.3 \\ 0.3 \end{bmatrix}, \quad \sigma = 1.1, \quad \gamma = 0.05 \quad \text{and}$$

$$\Delta \mathbf{x}_f = \mathbf{x}_f - \begin{bmatrix} 1.0 \\ 1.0 \end{bmatrix}$$

Three values of the parameter p is considered, i.e.,

$$\mathbf{R}_f(\mathbf{x}_f) = \begin{bmatrix} \mathbf{R}_f(\mathbf{x}_f, p_{f1}) \\ \mathbf{R}_f(\mathbf{x}_f, p_{f2}) \\ \mathbf{R}_f(\mathbf{x}_f, p_{f3}) \end{bmatrix} = \begin{bmatrix} \mathbf{R}_f(\mathbf{x}_f, 0.9) \\ \mathbf{R}_f(\mathbf{x}_f, 1.0) \\ \mathbf{R}_f(\mathbf{x}_f, 1.1) \end{bmatrix}$$

MATLAB FILES

```
function Rcp=Get_Coarse_Response(xcp);  
xc1=xcp(1,1);  
xc2=xcp(2,1);  
pc=xcp(3,1);  
Rc1p=(100*pc*(xc2-xc1*xc1)*(xc2-xc1*xc1))+(pc*pc*(1-xc1)*(1-  
xc1))+5;  
Rcp=Rc1p;
```

MATLAB FILES (Cont'd)

```
function Rs=Get_Surrogate_Response(xs);
load SMPs.mat %Load the surrogate model parameters
% These parameters are B,c,s,t,segmma,gama,Jfi,Rfi,xfi,lamda
B
c
s
t
segmma
gama
Jfi
Rfi
xfi
lamda
load P.mat %load matrix containing the values of the vector t
NP=size(P,1)
m=size(Jfi,1)
Nr=m/NP
Rs=zeros(m,1);
dx=xs-xfi
for j=1:NP
%1) The fine model point
    xs
%2)Get the jth value of the independent parameter
    Pfj=P(j,1)
%3)Get the corresponding coarse model point
    xc=B*dx+s*Pfj+c
%4)Get the corresponding jth coarse model independent parameter
    Pcj=t'*dx+segmma*Pfj+gama
%5)Construct the composed coarse model vector
    xcp=[xc
        Pcj]
%6)Get coarse model response at the transformed coarse model
%point and frequency
    Rcp=Get_Coarse_Response(xcp)
%7)Get the Jacobian of the responses corresponding to the jth
%value of P
    Jip=Jfi(((j-1)*Nr+1):(j*Nr),:)
%8)Get the fine model responses corresponding to the jth value of
%P
    Rip=Rfi(((j-1)*Nr+1):(j*Nr),1)
%9)Construct the surrogate model response at the jth value of P
    Rsp=lamda*Rcp+(1-lamda)*(Rip+Jip*dx)
%10)Accumulate this value in the vector Rs
    Rs(((j-1)*Nr+1):(j*Nr),1)=Rsp
    pause
end
```


RESULTS FOR CASE STUDY (a)

B =

1.1000 -0.2000
0.2000 0.9000

c =

-0.3000
0.3000

s =

0.0100
0.0100

t =

0.0100
0.0100

segmma =

1.1000

gama =

0.0500

Jfi =

36.3803 37.8284
40.0509 42.1956
43.6871 46.6336

Rfi =

12.0359
13.0693
14.1579

xfi =

1
1

lamda =

0.5000

NP =

3

m =

3

RESULTS FOR CASE STUDY (a) (Cont'd)

$$\text{Nr} = \\ 1$$

$$\text{dx} = \\ 0.2000 \\ -0.2000$$

First Pass

$$1) \text{xs} = \\ 1.2000 \\ 0.8000$$

$$2) \text{P}_{fj} = \\ 0.9000$$

$$3) \text{xc} = \\ -0.0310 \\ 0.1690$$

$$4) \text{P}_{cj} = \\ 1.0400$$

$$5) \text{xcp} = \\ -0.0310 \\ 0.1690 \\ 1.0400$$

$$6) \text{R}_{cp} = \\ 9.0864$$

$$7) \text{J}_{ip} = \\ 36.3803 \quad 37.8284$$

$$8) \text{R}_{ip} = \\ 12.0359$$

$$9) \text{R}_{sp} = \\ 10.4163$$

$$10) \text{R}_s = \\ 10.4163 \\ 0 \\ 0$$

RESULTS FOR CASE STUDY (a) (Cont'd)

Second Pass

$$\begin{aligned} 1) \text{ xs} &= \\ & 1.2000 \\ & 0.8000 \end{aligned}$$

$$\begin{aligned} 2) \text{ Pfj} &= \\ & 1 \end{aligned}$$

$$\begin{aligned} 3) \text{ xc} &= \\ & -0.0300 \\ & 0.1700 \end{aligned}$$

$$\begin{aligned} 4) \text{ Pcj} &= \\ & 1.1500 \end{aligned}$$

$$\begin{aligned} 5) \text{ xcp} &= \\ & -0.0300 \\ & 0.1700 \\ & 1.1500 \end{aligned}$$

$$\begin{aligned} 6) \text{ Rcp} &= \\ & 9.6914 \end{aligned}$$

$$\begin{aligned} 7) \text{ Jip} &= \\ & 40.0509 \quad 42.1956 \end{aligned}$$

$$\begin{aligned} 8) \text{ Rip} &= \\ & 13.0693 \end{aligned}$$

$$\begin{aligned} 9) \text{ Rsp} &= \\ & 11.1659 \end{aligned}$$

$$\begin{aligned} 10) \text{ Rs} &= \\ & 10.4163 \\ & 11.1659 \\ & 0 \end{aligned}$$

Third Pass

$$\begin{aligned} 1) \text{ xs} &= \\ & 1.2000 \\ & 0.8000 \end{aligned}$$

$$\begin{aligned} 2) \text{ Pfj} &= \\ & 1.1000 \end{aligned}$$

RESULTS FOR CASE STUDY (a) (Cont'd)

3) $x_c =$
-0.0290
0.1710

4) $P_{cj} =$
1.2600

5) $x_{cp} =$
-0.0290
0.1710
1.2600

6) $R_{cp} =$
10.3292

7) $J_{ip} =$
43.6871 46.6336

8) $R_{ip} =$
14.1579

9) $R_{sp} =$
11.9489

10) $R_s =$
10.4163
11.1659
11.9489

CASE STUDY (b)

The coarse model is given by

$$\mathbf{R}_c(\mathbf{x}_c, p) = \begin{bmatrix} 100p(x_{c2} - x_{c1}^2)^2 + p^2(1 - x_{c1})^2 + 5 \\ 100p(x_{c1} - 1)^2 + 300p^2(1 - x_{c2})^2 + 10 \end{bmatrix}$$

The fine model is given by

$$\mathbf{R}_f(\mathbf{x}_f, p_f) = \mathbf{R}_c(\mathbf{x}_c, p_c)$$

where

$$\begin{bmatrix} \mathbf{x}_c \\ p_c \end{bmatrix} = \begin{bmatrix} \mathbf{B} & \mathbf{s} \\ \mathbf{t} & \sigma \end{bmatrix} \begin{bmatrix} \Delta \mathbf{x}_f \\ p_f \end{bmatrix} + \begin{bmatrix} \mathbf{c} \\ \gamma \end{bmatrix},$$

and

$$\mathbf{B} = \begin{bmatrix} 1.1 & -0.2 \\ 0.2 & 0.9 \end{bmatrix}, \quad \mathbf{s} = \mathbf{t} = \begin{bmatrix} 0.01 \\ 0.01 \end{bmatrix}, \quad \mathbf{c} = \begin{bmatrix} -0.3 \\ 0.3 \end{bmatrix}, \quad \sigma = 1.1, \quad \gamma = 0.05 \quad \text{and}$$

$$\Delta \mathbf{x}_f = \mathbf{x}_f - \begin{bmatrix} 1.0 \\ 1.0 \end{bmatrix}$$

Three values of the parameter p is considered, i.e.,

$$\mathbf{R}_f(\mathbf{x}_f) = \begin{bmatrix} \mathbf{R}_f(\mathbf{x}_f, p_{f1}) \\ \mathbf{R}_f(\mathbf{x}_f, p_{f2}) \\ \mathbf{R}_f(\mathbf{x}_f, p_{f3}) \end{bmatrix} = \begin{bmatrix} \mathbf{R}_f(\mathbf{x}_f, 0.9) \\ \mathbf{R}_f(\mathbf{x}_f, 1.0) \\ \mathbf{R}_f(\mathbf{x}_f, 1.1) \end{bmatrix}$$

MATLAB FILES

```
function Rcp=Get_Coarse_Response(xcp);
xc1=xcp(1,1);
xc2=xcp(2,1);
pc=xcp(3,1);
Rc1p=(100*pc*(xc2-xc1*xc1)*(xc2-xc1*xc1)+(pc*pc*(1-xc1)*(1-
xc1))+5;
Rc2p=(100*pc*(xc1-1)*(xc1-1)+(300*pc*pc*(1-xc2)*(1-xc2))+10;
Rcp=[ Rc1p
      Rc2p];
```

RESULTS FOR CASE STUDY (b)

B =

1.1000 -0.2000
0.2000 0.9000

c =

-0.3000
0.3000

s =

0.0100
0.0100

t =

0.0100
0.0100

segmma =

1.1000

gama =

0.0500

Jfi =

36.3803 37.8284
-379.0781 -342.6384
40.0509 42.1956
-429.4207 -425.2945
43.6871 46.6336
-481.6569 -516.6460

Rfi =

12.0359
338.2679
13.0693
390.2642
14.1579
445.4518

xfi =

1
1

lamda =

0.5000

RESULTS FOR CASE STUDY (b) (Cont'd)

NP =
3

m =
6

Nr =
2

dx =
0.2000
-0.2000

First Pass

1) xs =
1.2000
0.8000

2) Pfj =
0.9000

3) xc =
-0.0310
0.1690

4) Pcj =
1.0400

5) xcp =
-0.0310
0.1690
1.0400

6) Rcp =
9.0864
344.6212

7) Jip =
36.3803 37.8284
-379.0781 -342.6384

8) Rip =
12.0359
338.2679

RESULTS FOR CASE STUDY (b) (Cont'd)

9) $R_{sp} =$
10.4163
337.8005

10) $R_s =$
10.4163
337.8005
0
0
0
0

Second Pass

1) $x_s =$
1.2000
0.8000

2) $P_{fj} =$
1

3) $x_c =$
-0.0300
0.1700

4) $P_{cj} =$
1.1500

5) $x_{cp} =$
-0.0300
0.1700
1.1500

6) $R_{cp} =$
9.6914
405.3246

7) $J_{ip} =$
40.0509 42.1956
-429.4207 -425.2945

8) $R_{ip} =$
13.0693
390.2642

RESULTS FOR CASE STUDY (b) (Cont'd)

9) $R_{sp} =$
11.1659
397.3817

10) $R_s =$
10.4163
337.8005
11.1659
397.3817
0
0

Third Pass

1) $x_s =$
1.2000
0.8000

2) $P_{fj} =$
1.1000

3) $x_c =$
-0.0290
0.1710

4) $P_{cj} =$
1.2600

5) $x_{cp} =$
-0.0290
0.1710
1.2600

6) $R_{cp} =$
10.3292
470.7331

7) $J_{ip} =$
43.6871 46.6336
-481.6569 -516.6460

8) $R_{ip} =$
14.1579
445.4518

RESULTS FOR CASE STUDY (b) (Cont'd)

9) Rsp =
11.9489
461.5913

10) Rs =
10.4163
337.8005
11.1659
397.3817
11.9489
461.5913