

Appendix A

Evaluation of Matlab code for FWI

To evaluate the result of the FWI coding and workflow, the test was made by using the true model as an initial model, (Marmousi model). The FWI workflow was then performed as normal with 19 shot points along surface with 200 active receivers, the receivers spacing is 10 meter and shot spacing is 160 meter. The result shows that the residual data has zero amplitude for all sampling, Figure A, and leads to zero magnitude when calculated a global gradient of misfit function calculation, Figure B, as well as the calculation of misfit function.

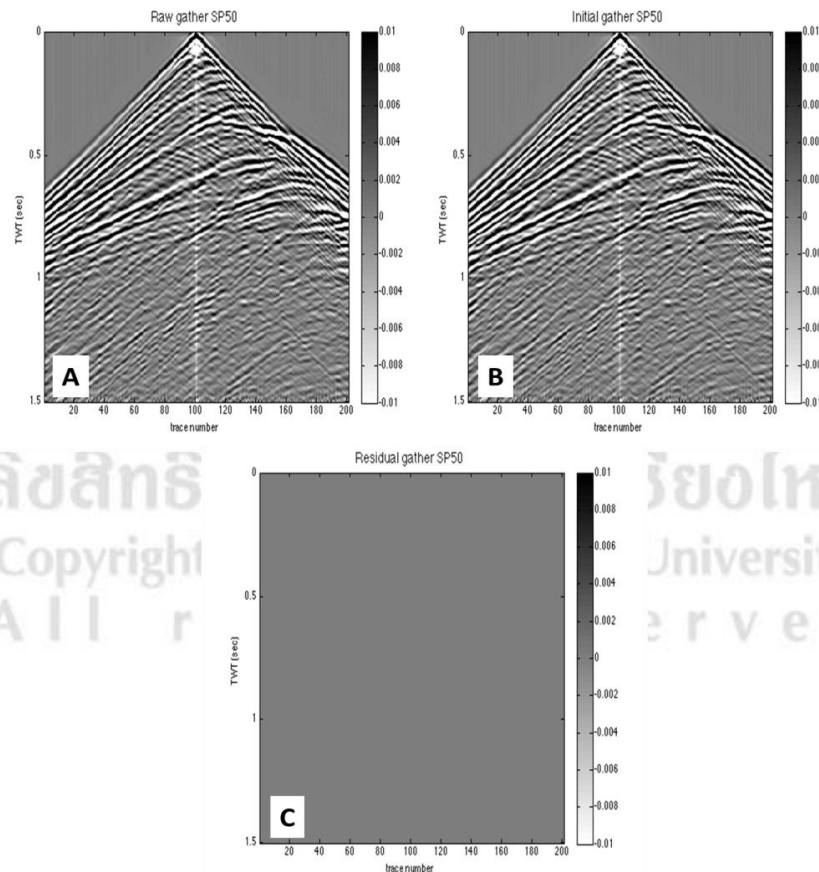


Figure A.1 example of shot gather (A) raw shot gathers 160 (B) initial shot gather 160 and (C) the residual gather 160 shows zero amplitude

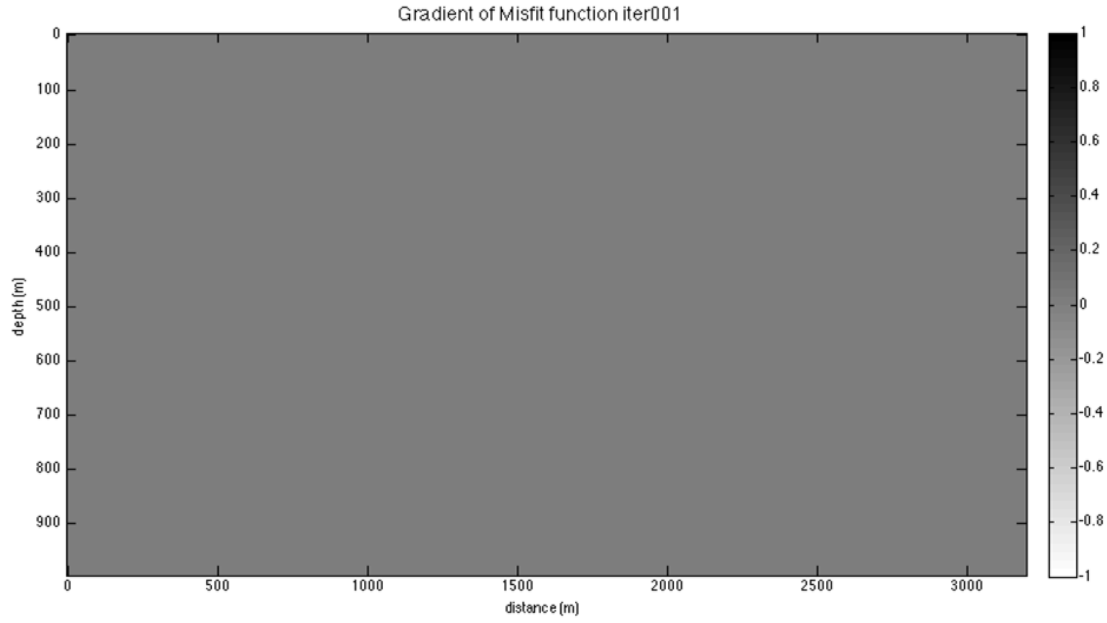


Figure A.2 A global gradient of misfit function compute from 19 shots show zero value for all cells.

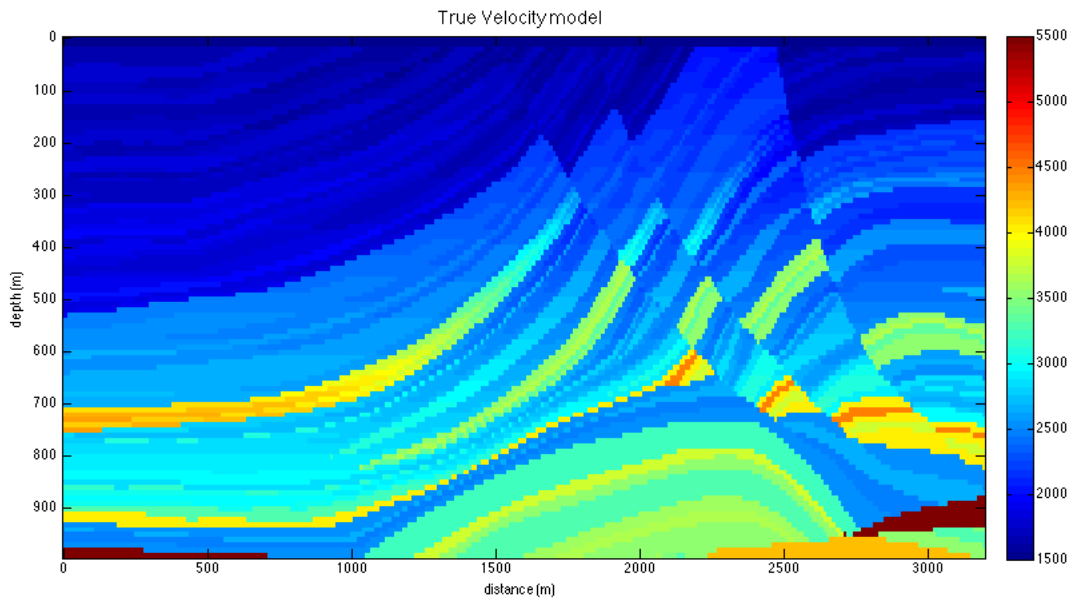


Figure A.3 selected of Marmousi model, which were used as true and initial velocity model.

Appendix B

Matlab code for FWI

- a) Generating synthetic shot gathers with respect to the initial velocity model.

```
%-----%
[inz,inx]=size(vmodel); %input velocity model
%extend velocity model
extx=200; extz=300;
nze=inz+extz; nxe=inx+extx;
vmodelx=zeros(nze,nxe);
vmodelx(1:inz,(extx+1):(extx+inx))=vmodel(1:inz,1:inx);
for ix=1:extx
    vmodelx(1:inz,ix)=vmodel(1:inz,1);
    vmodelx(1:inz,(extx+inx+ix))=vmodel(1:inz,inx);
end
for iz=1:extz
    vmodelx(inz+iz,:)=vmodelx(inz,:);
end
cd(intsp_path); % intsp_path
%crate shot record
dtstep=0.001;%time step
[nz,nx]=size(vmodelx);
x=(0:nx-1)*dx;z=(0:nz-1)*dx;
xrec=(extx:(extx+inx-1))*dx;
zrec=zeros(size(xrec));%receiver at zero depth
parfor count=1:ttsp
    % shoting every 16 cells
    sp_x=((count-1)*incsp)+incsp;
```

```

snap1=zeros(size(vmodelx));
xshot=dx*(extx+sp_x-1);%shot location
ix=near(x,xshot);
snap2=snap1;
snap2(1,ix(1))=1;%place the source
[seismogram4,seis4d,t]=afd_shotrec(dx,dtstep,dt,tmax,vmodelx,snap1,
                                snap2,xrec,zrec, [0 5 35 50],0,2);

%trace selection
tr1=sp_x-100; tr2=sp_x+100;
if tr1 < 1
    tr1=1;
end
if tr2 > inx
    tr2=inx;
end
output=seismogram4(:,tr1:tr2);
% create trace header
th=zeros(120,size(output,2));
th(15,:)=1; th(18,:)=1; th(58,:)=size(output,1);
th(6,:)=sp_x;
th(8,:)=1:size(output,2);

% output segy
segy_name=['003_vinitSp' num2str(sp_x) '_' itr '.sgy'];
altwritese gy(segy_name,output,dt,[],[],[],[],[],th);
end
clear ix iz extx extz nze nxe vmodelx dtstep nz nx x z xrec zrec count th
%-----%

```

b) Creating residual data and calculate the misfit function

```
%-----%
for count=1:ttsp
    % shoting every 16 cells
    spnb=((count-1)*incsp)+incsp;
    cd(rawsp_path);
    disp(['computed shot number:' num2str(spnb)])
    segy_name1=['002_RawSp' num2str(spnb) '.sgy'];
    [rawsp,~,ch,bh,th]=altreadsegy(segy_name1,'textheader','yes',
                                   'binaryheader','yes','traceheader','yes');

    cd(intsp_path);
    segy_name2=['003_vinitSp' num2str(spnb) '_' itr '.sgy'];
    initsp=altreadsegy(segy_name2);
    [nz1,nx1]=size(rawsp); [nz2,nx2]=size(initsp);
    if nz1-nz2==0 && nx1-nx2==0
        tmp1=rawsp-initsp;
        difsp=tmp1;
        segy_name=['004_diffSp' num2str(spnb) '_' itr '.sgy'];
        altwritesegy(segy_name,difsp,dt,[],[],[],[],[],[],th);
    else
        disp('data not compatible');
    end
    %plotimage(difsp);
    tmp01=difsp.^2;
    tmp02(count,1)=sum(sum(tmp01,2),1).*0.5;
end
% misfit function
misfit=sum(tmp02,1);
disp(['misfit function: ' num2str(misfit)]);
job1(3,:)=misfit;
%-----%
```

c) Generate virtual source with respect to an initial model.

```
%-----%
%create data
cd(sp2rp_path);
%extended velocity model
[inz,inx]=size(vmodel);
extx=200; extz=300;
nze=inz+extz; nxe=inx+extx;
vmodelx=zeros(nze,nxe);
vmodelx(1:inz,(extx+1):(extx+inx))=vmodel(1:inz,1:inx);
for ix=1:extx
    vmodelx(1:inz,ix)=vmodel(1:inz,1);
    vmodelx(1:inz,(extx+inx+ix))=vmodel(1:inz,inx);
end
for iz=1:extz
    vmodelx(inz+iz,:)=vmodelx(inz,:);
end
%create shot record
dtstep=0.001;%time step
[nz,nx]=size(vmodelx);
x=(0:nx-1)*dx;z=(0:nz-1)*dx;
%%%create receiver geometry%%%
% xrec=x; %receiver location
% zrec=zeros(size(xrec)); %receiver at zero depth
kk=0; xrec=zeros(1,(inz*inx)); zrec=zeros(1,(inz*inx));
for jj=1:inz
    for ii=extx+1:extx+inx
        kk=(kk+1);
        xrec(1,kk)=(ii-1)*dx; %receiver location
        zrec(1,kk)=(jj-1)*dx; %receiver at various depth
    end
end
end
```

```

parfor sp_x=1:inx % use parfor for parallel machine
    snap1=zeros(size(vmodelx));
    xshot=dx*(extx+sp_x-1);%shot location (location+extended grid)
    ix=near(x,xshot);
    snap2=snap1;
    snap2(1,ix(1))=1;%place the source
    %crate shot record
    %fourth order laplacian
    [sp2ssfrp,seis4,t]=afd_shotrec(dx,dtstep,dt,tmax,vmodelx,snap1,
                                   snap2,xrec,zrec,[0 5 35 50],0,2);
    %create number related to location and depth
    sp=1000+sp_x;
    % create trace header
    th=zeros(120,size(sp2ssfrp,2));
    th(15,:)=1; th(18,:)=1; th(58,:)=size(sp2ssfrp,1);
    th(6,:)=sp_x; th(8,:)=1:size(sp2ssfrp,2);
    % output segy
    disp(['output segy' num2str(sp)])
    segy_name=['010_sp2rp_' num2str(sp) '.sgy'];
    altwritesegy(segy_name,(sp2ssfrp),dt,[],[],[],[],[],th)
end
%-----%
% sort data
[nz,nx]=size(vmodel);
cd(sp2rp_path);
sp2rp=zeros(sample,nx,nz*nx);
output=zeros(sample,nx);
for kk=1:nx %from 1:nx
    sp=1000+kk;
    disp(['input sp2rp: ' num2str(sp)]);
    segy_name=['010_Sp2Rp_' num2str(sp) '.sgy'];
    tmp01=altreadseggy(segy_name); %read in segy file

```

```

    % change matrix dimension
    tmp02=permute(tmp01, [1 3 2]);
    sp2rp(:,kk,:)=tmp02;
end
clear tmp01 tmp02 kk sp segy_name;
% virtual source
cd(virtual_path);
for jj=1:(nz*nx)
    output=sp2rp(:,:,jj);
    spz=fix((jj-1)/nx)+1; spx=jj-((spz-1)*nx);
    vpoint=(((1000)*1000)+spx)*10000+spz;
    tmpv=(1000+spx)*10000+spz;
    % create trace header
    th=zeros(120,size(output,2));
    th(15,:)=1; th(18,:)=1; th(58,:)=size(output,1);
    th(6,:)=tmpv;
    th(8,:)=1:size(output,2);
    % output segy
    segy_out=([ '011_virtualsp_' num2str(vpoint) '.sgy' ]);
    disp(segy_out);
    altwritesegy(segy_out,output,dt,[],[],[],[],[],[],th);
end
%-----%

```

d) Calculation of the gradient of misfit function

```

%-----%

[nz,nx]=size(vmodel);

for count=1:ttsp

    grad_misfit=zeros(nz,nx); sp_nb=((count-1)*incsp)+incsp;

    cd(sp2rp_path);

    sp1=1000+sp_nb;

```

```

seg_y_name2=['012_firstArrivalTime_' num2str(sp_nb) '.sgy'];
fbpk=altreadsegy(seg_y_name2);% read in sp2rp gather
cd(intsp_path);
seg_y_name1=['004_diffSp' num2str(sp_nb) '_' itr '.sgy'];
tmpdiff=altreadsegy(seg_y_name1);% read in diff gather
diffsp=reform(tmpdiff,dt,2.0); % gain recovery for deeper part
tr1=sp_nb-100; tr2=sp_nb+100;
    if tr1 < 1
        tr1=1;
    end
    if tr2 > nx
        tr2=nx;
    end
cd(virtual_path);
for spz=3:nz
    trstt=sp_nb-(70+fix((spz)*40/nz));
    trend=sp_nb+(70+fix((spz)*40/nz));
    if trstt < 1
        trstt=1;
    end
    if trend > nx
        trend=nx;
    end
    parfor spx=trstt:trend %1:nx
        tmpfbpk=fbpk;
        sp2=(((1000)*1000+spx)*10000)+spz;

```

```

seggy_name3=['011_virtualsp_' num2str(sp2) '.sgy'];
tmp5=altreadseggy(seggy_name3);
dif_pnt=tmp5(:,tr1:tr2);
% generate partial derivative wavefields
[iz,ix]=size(dif_pnt);
jacob=zeros(iz,ix);
kk=(spz-1)*nx+spx;
v=tmpfbpk(:,kk);
AA=conv2(dif_pnt,v);
jacob(1:iz,:)-AA(5:iz+4,:);
tmp1=jacob;
% gradient of misfit function
% zero-lag cross correlation of partial wavefield & residual data
tmp_xcorr=xcorr2(diffsp,tmp1);
grad_misfit(spz,spx)=tmp_xcorr(size(jacob,1),size(jacob,2));
tmp25=tmp_xcorr(size(jacob,1),size(jacob,2));
disp(['calculating sp' num2str(sp_nb) ':' num2str(spz) '-'
      num2str(spx) '=' num2str(tmp25)]);
end
end
cd(intsp_path);
sp_out=(1000+sp_nb);
seggy_name4=['013_graMisFit_' num2str(sp_out) '_' itr '.sgy'];
altwriteseigy(seggy_name4,grad_misfit,dx);
end
%-----%

```

e) Calculation of Global gradient of misfit function

```
%-----%
[nz,nx]=size(vmodel);
tmp_all_grad=zeros(nz,nx,ttsp);
count=0;
for count=1:ttsp
    sp_nb=((count-1)*incsp)+incsp;
    sp_in=1000+sp_nb;
    disp(['input gradientMisFit Sp: ' num2str(sp_nb)]);
    cd(intsp_path);
    segy_name2=(['013_graMisFit_' num2str(sp_in) '_' itr '.sgy']);
    [tmp2,~,ch,bh,th]=altreadsegy(segy_name2,'textheader','yes',
                                'binaryheader','yes','traceheader','yes');
    tmp_all_grad(1:nz,1:size(tmp2,2),count)=tmp2(1:nz,1:size(tmp2,2));
end
disp('stacking all gradientMisFit matrix');
all_grad=(sum(tmp_all_grad,3));
% update trace number or CDP number 1:nx
th(12,:)=1:(size(all_grad,2));
% update offset X
th(20,:)=0:dx:((size(all_grad,2))-1)*dx;
segy_name11=(['014_GlobalGradientMisFit_' itr '.sgy']);
altwritesegegy(segy_name11,all_grad,dx,[],[],[],[],ch,bh,th);
%-----%
```

f) Calculation of model perturbation and model updating

```
%-----%
%input velocity model
cd([proj_path project '\MODEL']);
rmodel=altreadsegy('vmodel_raw.sgy');
offx=[0, ((size(rmodel,2)-1)*dx)];
offz=[0, ((size(rmodel,1)-1)*dx)];
```

```

figure(1);
imagesc(offx,offz,rmodel,[1500 5500]); colorbar;
title('Raw velocity model'); xlabel('Distance (m)'); ylabel('depth (m)');
%input velocity model
vint=vmodel;
[nz,nx]=size(vint);
figure(2);
imagesc(offx,offz,vint,[1500 5500]); colorbar;
title('Initial velocity model'); xlabel('Distance (m)'); ylabel('depth (m)');
% input gradient of misfit function
cd(intsp_path);
seggy_name11=(['014_GlobalGradientMisFit_' itr '.sgy']);
[tmp,~,ch,bh,th]=altreadsegy(seggy_name11,'textheader','yes','binaryheader','
yes','traceheader','yes');
grad=tmp;
% scale search
cd([proj_path project 'JOBS\master_jobs\']);
t041_scale_search_ver04;
dmodel=grad.*scale;
nmodel=vint+dmodel;
figure(3);
imagesc(offx,offz,nmodel,[1500 5500]); colorbar;
title(['Velocity model ' itr]); xlabel('Distance (m)'); ylabel('depth (m)');
cd([proj_path project '\MODEL\']);
seggy_out=(['vmodel_' itr '.sgy']);
altwritesegegy(seggy_out,nmodel,dx,[],[],[],[],ch,bh,th);
job1(3,:)=scale;
%-----%

```

g) Scale search for calculation of model perturbation

```
%-----%
calsp=9; % calculated 11 shots
cal_scale=[0;5;10;20;40;80];
output=zeros(length(cal_scale),2);
for ii=1:length(cal_scale)
    tmp_scale=cal_scale(ii,1);
    output(ii,1)=tmp_scale; %output scale
    disp(['comput scale:' num2str(tmp_scale)])
    vtmp=vint+(grad.*tmp_scale);
    %extended velocity model
    [inz,inx]=size(vtmp);
    extx=200; extz=300;
    nze=inz+extz; nxe=inx+extx;
    vmodelx=zeros(nze,nxe);
    vmodelx(1:inz,(extx+1):(extx+inx))=vtmp(1:inz,1:inx);
    for ix=1:extx
        vmodelx(1:inz,ix)=vtmp(1:inz,1);
        vmodelx(1:inz,(extx+inx+ix))=vtmp(1:inz,inx);
    end
    for iz=1:extz
        vmodelx(inz+iz,:)=vmodelx(inz,:);
    end
    %crate shot record
    dtstep=0.001;%time step
    [nz,nx]=size(vmodelx);
    x=(0:nx-1)*dx;z=(0:nz-1)*dx;
    xrec=(extx:(extx+inx-1))*dx;
    zrec=zeros(size(xrec));%receiver at zero depth
    parfor count=1:calsp
        % shoting every 32 cells
        sp_x=((count-1)*32)+32;
```

```

snap1=zeros(size(vmodelx));
xshot=dx*(extx+sp_x-1);%shot location
ix=near(x,xshot);
snap2=snap1;
snap2(1,ix(1))=1;%place the source
[seismogram4,seis4d,t]=afd_shotrec(dx,dtstep,dt,tmax,vmodelx,snap1,
                                snap2,xrec,zrec,[0 5 35 50],0,2);

%trace selection
tr1=sp_x-100; tr2=sp_x+100;
if tr1 < 1
    tr1=1;
end
if tr2 > inx
    tr2=inx;
end
intsp=seismogram4(:,tr1:tr2);
%input Raw shot gathers
cd(rawsp_path);
disp(['input raw shot number:' num2str(sp_x)])
seggy_name1=['002_RawSp' num2str(sp_x) '.sgy'];
rawsp=altreadsegy(seggy_name1);
difsp=rawsp-intsp;
tmp01=difsp.^2;
tmp02(count,1)=sum(sum(tmp01,2),1).*0.5;
end
misfit=sum(tmp02,1);
output(ii,2)=misfit; %output misfit
end
% calculated equation fit with this dataset
y1=output(:,2); sc1=output(:,1);
eq=polyfit(sc1,y1,4); % polynomial with power 4 equation
sc2=(0:1:100)'; y2=polyval(eq,sc2); output2=[sc2,y2];

```

```

% output excel file
cd([proj_path project '\LISTS']);
xlswrite(['scale_search_' project '_' itr '.xlsx'],output,1,['A1:B'
num2str(length(output))]);
xlswrite(['scale_search_' project '_' itr '.xlsx'],output2,1,['D1:E'
num2str(length(output2))]);
cd([proj_path project]);
[A,SI]=min(output2);
scale=output2(SI(1,2),1);
%-----%

```

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