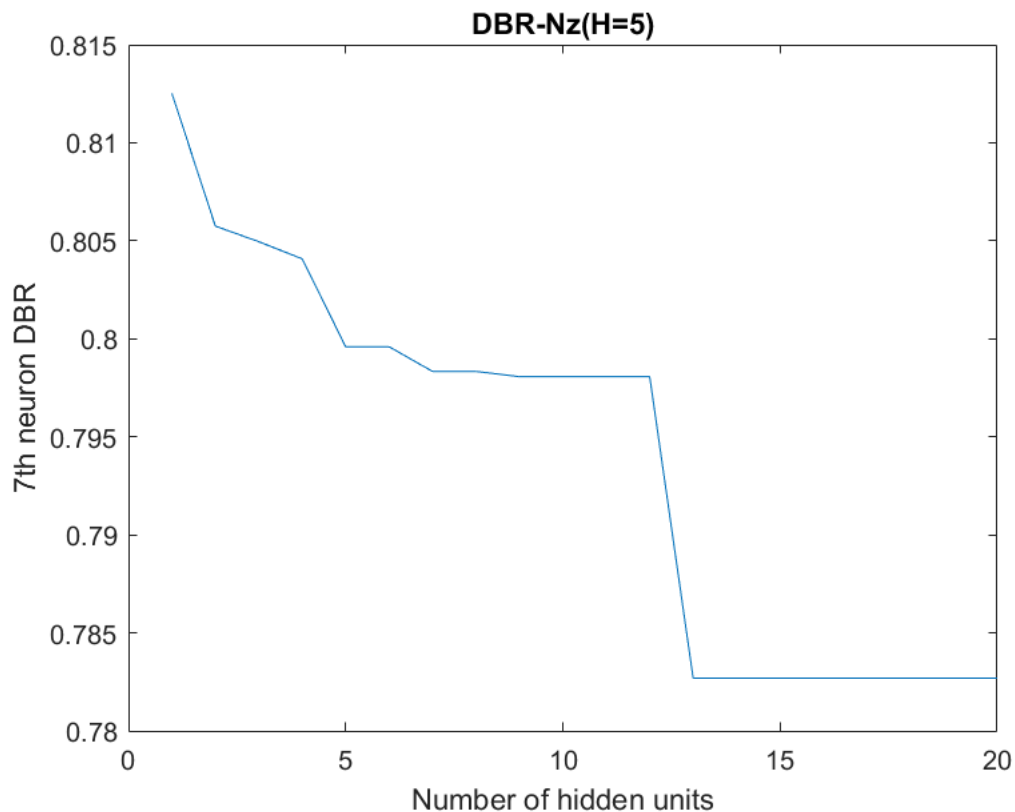


Result Analyze

```
close all;clear;clc;
addpath models/
load data/data_rat010_0615_spike_train_selected_with_delay.mat
load results/GLM_explore_H_new.mat
load results/GLM_sec_explore_H_new.mat
load results/ANN_explore_Nz_new.mat
load results/ANN_explore_H_new.mat

% ANN Nz-DBR
ANN_Nz_DBR = zeros(1,20);
Nzlist = 1:20;
bestDBR = Inf;
for Nz=Nzlist
    for i=1:ceil(Nz/5)*16
        bestDBR = min(ANN_explore_Nz(Nz,i).DBR, bestDBR);
    end
    ANN_Nz_DBR(Nz)=bestDBR;
end
figure(1)
plot(Nzlist, ANN_Nz_DBR)
xlabel("Number of hidden units")
ylabel("7th neuron DBR")
title("DBR-Nz(H=5)")
```

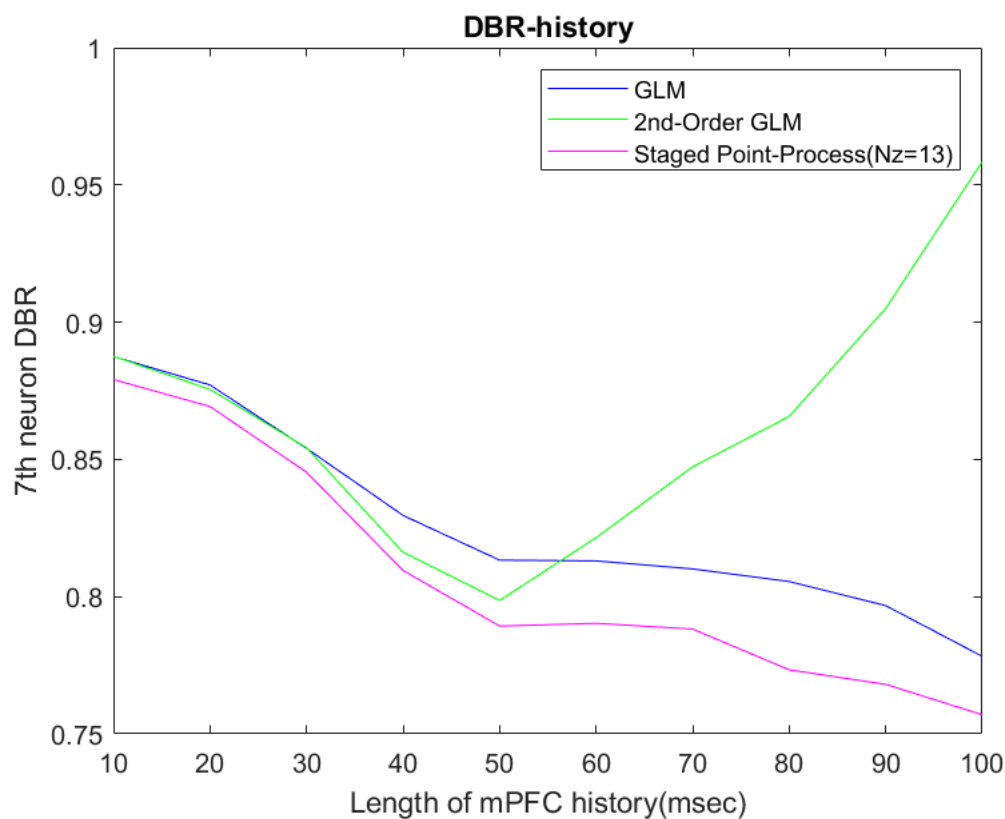


```
% get DBRs from differnt model result
GLM_sec_DBR = zeros(1,10);
```

```

GLM_DBR = zeros(1,10);
ANN_DBR = ones(1,10)*10;
for i=1:10
    GLM_DBR(i) = GLM_explore_H(i).DBR;
    GLM_sec_DBR(i) = GLM_sec_explore_H(i).DBR;
    for j=1:20
        ANN_DBR(i) = min(ANN_DBR(i), ANN_explore_H(i,j).DBR);
    end
end
% plot DBR-history result
figure(2)
plot(10:10:100, GLM_DBR, 'b')
hold on
plot(10:10:100, GLM_sec_DBR, 'g')
plot(10:10:100, ANN_DBR, 'm')
hold off
legend("GLM", "2nd-Order GLM", "Staged Point-Process(Nz=13)")
xlabel("Length of mPFC history(msec)")
xlim([10 100])
ylabel("7th neuron DBR")
title("DBR-history")

```



Take history = 50msec, kernel size = 0.5s

```

H=5;
% get GLM params & test result
W = GLM_explore_H(H).W;

```

```

M1Idx = GLM_explore_H(H).M1Idx;
[~,~,~,~,~,testX,~,~,testY] = splitDataAdvance(1,mPFCspike,M1spike(:,M1Idx),eventTrain,optimalL
GLMtestLambdaYpre = GLMmodel(testX, W);
GLMccList = zeros(1, 1000/10);
% smooth result
for kernelSize=10:10:1000
    smoothedLambda = gaussianSmooth(testY, kernelSize);
    smoothedLambdaPre = gaussianSmooth(GLMtestLambdaYpre, kernelSize);
    cc = corrcoef(smoothedLambda, smoothedLambdaPre);
    GLMccList(kernelSize/10) = cc(2);
end

% 2nd Order GLM
W = GLM_sec_explore_H(H).W;
M1Idx = GLM_sec_explore_H(H).M1Idx;
[~,~,~,~,~,testX,~,~,testY,~,~,testEvent] = splitDataAdvance(2,mPFCspike,M1spike(:,M1Idx),event
GLMsectestLambdaYpre = GLMmodel(testX, W);
GLM_sec_ccList = zeros(1, 1000/10);
% smooth
for kernelSize=10:10:1000
    smoothedLambda = gaussianSmooth(testY, kernelSize);
    smoothedLambdaPre = gaussianSmooth(GLMsectestLambdaYpre, kernelSize);
    cc = corrcoef(smoothedLambda, smoothedLambdaPre);
    GLM_sec_ccList(kernelSize/10) = cc(2);
end

% ANN
bestDBR = Inf;
for i=1:48
    if (ANN_explore_Nz(13,i).DBR<bestDBR)
        bestDBR = ANN_explore_Nz(13,i).DBR;
        W = ANN_explore_Nz(13,i).W;
        M1Idx = ANN_explore_Nz(13,i).M1Idx;
    end
end
[~,~,~,~,~,testX,~,~,testY] = splitDataAdvance(1,mPFCspike,M1spike(:,M1Idx),eventTrain,optimalL
[~, Nx] = size(testX);
ANNtestLambdaYpre = ANNmodel(testX, W, Nx, 13);
ANNccList = zeros(1, 1000/10);
% smooth
for kernelSize=10:10:1000
    smoothedLambda = gaussianSmooth(testY, kernelSize);
    smoothedLambdaPre = gaussianSmooth(ANNtestLambdaYpre, kernelSize);
    cc = corrcoef(smoothedLambda, smoothedLambdaPre);
    ANNccList(kernelSize/10) = cc(2);
end

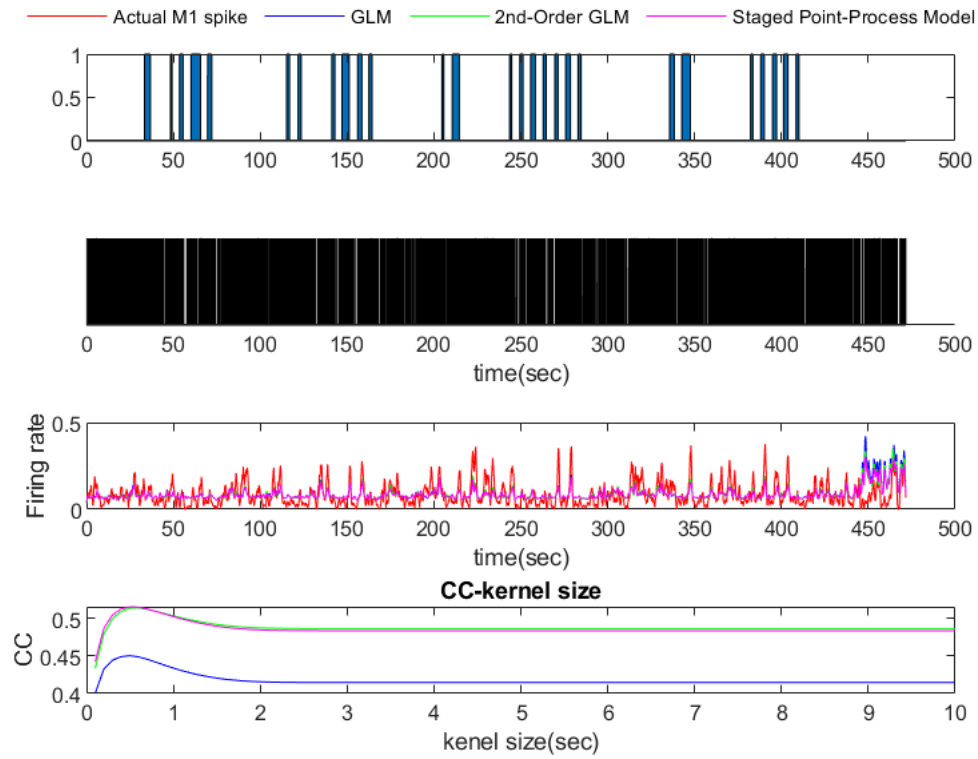
% optimal smooth kernel size result
kernelSize = 50;
smoothedLambda = gaussianSmooth(testY, kernelSize);
smoothedGLMLambdaPre = gaussianSmooth(GLMtestLambdaYpre, kernelSize);
smoothedGLMsecLambdaPre = gaussianSmooth(GLMsectestLambdaYpre, kernelSize);
smoothedANNLambdaPre = gaussianSmooth(ANNtestLambdaYpre, kernelSize);

```

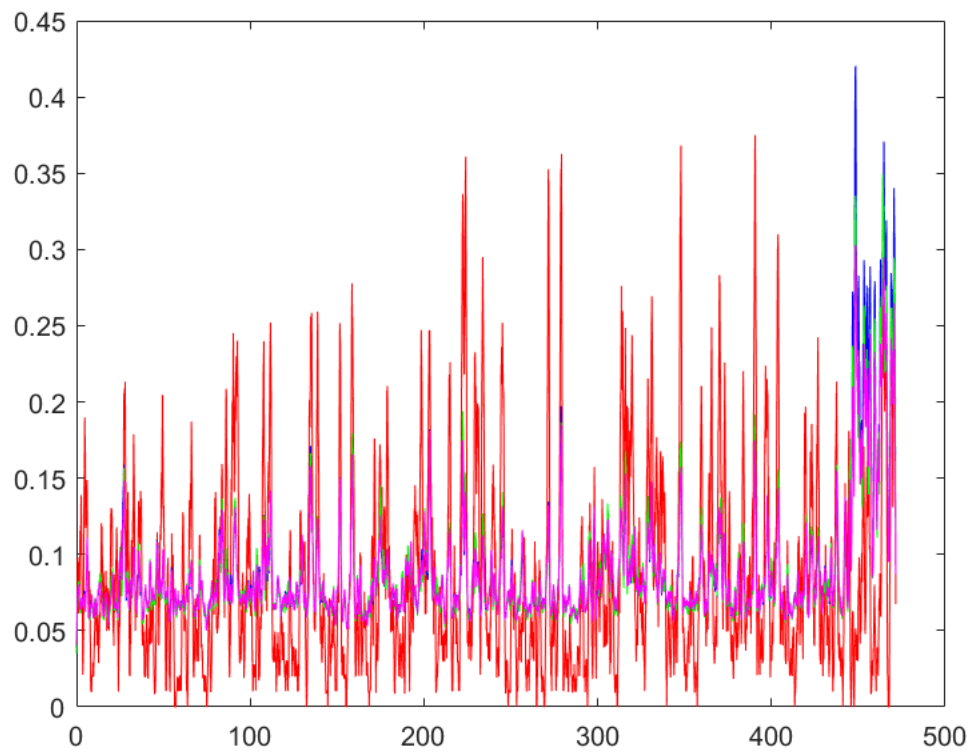
```

% take part of result for display
spikeLength = length(testY);
index = 1:spikeLength;
t = index/100;
figure(3)
% real spike
subplot(4,1,2)
area(t, testY(index))
xlabel("time(sec)")
set(gca, 'TickLength', [0 0])
set(gca, 'ytick', [])
set(gca, 'box', 'off')
% smoothed results
subplot(4,1,3)
h{1} = plot(t, smoothedLambda(index), 'r');
hold on
h{2} = plot(t, smoothedGLMLambdaPre(index), 'b');
h{3} = plot(t, smoothedGLMsecLambdaPre(index), 'g');
h{4} = plot(t, smoothedANNLambdaPre(index), 'm');
hold off
xlabel("time(sec)")
ylabel("Firing rate")
% cc analyze
subplot(4,1,4)
plot(0.1:0.1:10, GLMccList, 'b')
hold on
plot(0.1:0.1:10, GLM_sec_ccList, 'g')
plot(0.1:0.1:10, ANNccList, 'm');
hold off
xlabel("kenel size(sec)")
xlim([0 10])
ylabel("CC")
title("CC-kernel size")
legend([h{1}; h{2}; h{3}; h{4}], "Actual M1 spike", "GLM", "2nd-Order GLM", "Staged Point-Process", ...
    "Position",[0.5 0.95 0 0], "Box","off", "Orientation","horizontal")
% legend([h{1}; h{2}; h{3}], "Actual M1 spike", "GLM", "2nd-Order GLM", ...
% "Position",[0.5 0.95 0 0], "Box","off", "Orientation","horizontal")
subplot(4,1,1)
area((1:length(testEvent))/100, testEvent)

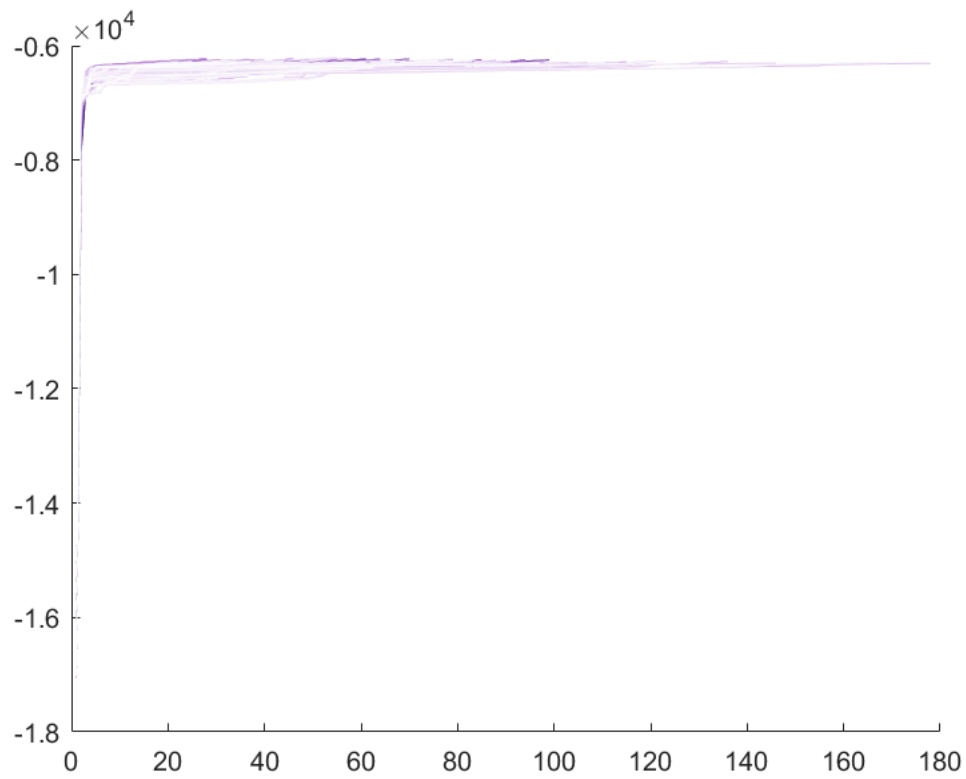
```



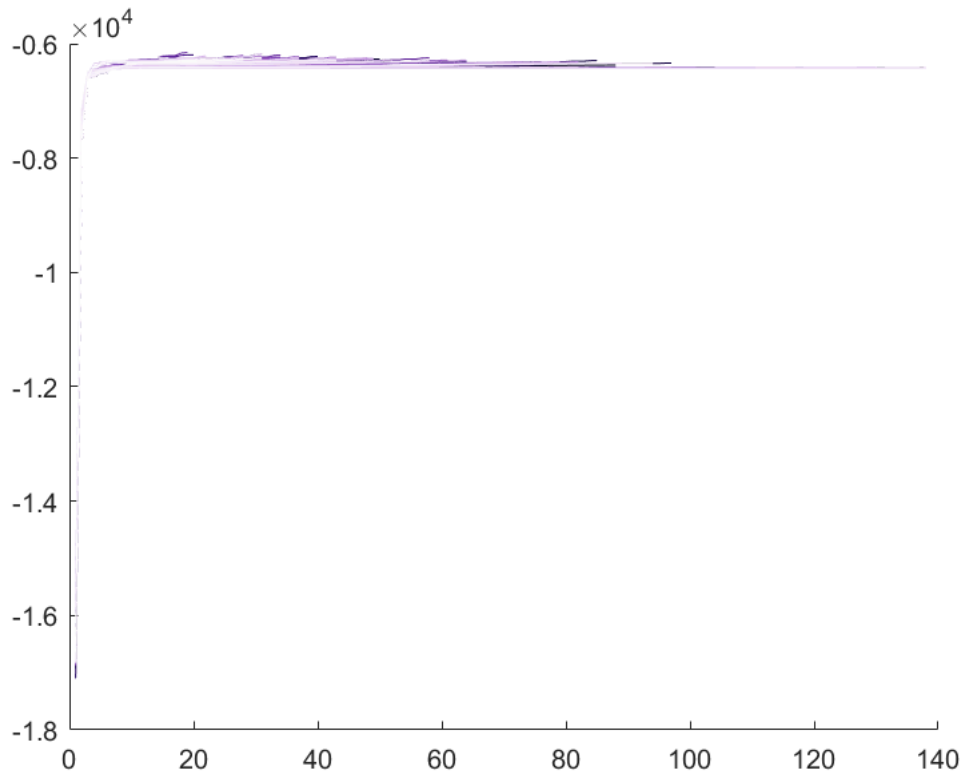
```
figure
h{1} = plot(t, smoothedLambda(index), 'r');
hold on
h{2} = plot(t, smoothedGLMLambdaPre(index), 'b');
h{3} = plot(t, smoothedGLMsecLambdaPre(index), 'g');
h{4} = plot(t, smoothedANNLambdaPre(index), 'm');
hold off
```



```
figure
hold on
for i=1:800
    [Nz, idx] = getParamIndex(i);
    LHistory = ANN_explore_Nz(Nz,idx).LHistory;
    LHistory(LHistory==0) = nan;
    h=plot(LHistory);
    set(h, 'color', [i/800, i*i/640000, sqrt(i)/sqrt(800)])
end
hold off
```



```
figure
hold on
for i=1:200
    LHistory = ANN_explore_H(i).LHistory;
    LHistory(LHistory==0) = nan;
    h=plot(LHistory);
    set(h, 'color', [i/200, i*i/40000, sqrt(i)/sqrt(200)])
end
hold off
```



```
H=5;
```

```
% get GLM params & train result
```

```
W = GLM_explore_H(H).W;
```

```
M1Idx = GLM_explore_H(H).M1Idx;
```

```
[~,~,~,trainX,~,~,trainY,~,~] = splitDataAdvance(1,mPFCspike,M1spike(:,M1Idx),eventTrain,optima
```

```
GLMtrainLambdaYpre = GLMmodel(trainX, W);
```

```
GLMccList = zeros(1, 1000/10);
```

```
% smooth result
```

```
for kernelSize=10:10:1000
```

```
    smoothedLambda = gaussianSmooth(trainY, kernelSize);
```

```
    smoothedLambdaPre = gaussianSmooth(GLMtrainLambdaYpre, kernelSize);
```

```
    cc = corrcoef(smoothedLambda, smoothedLambdaPre);
```

```
    GLMccList(kernelSize/10) = cc(2);
```

```
end
```

```
% 2nd Order GLM
```

```
W = GLM_sec_explore_H(H).W;
```

```
M1Idx = GLM_sec_explore_H(H).M1Idx;
```

```
[~,~,~,trainX,~,~,trainY,~,~,trainEvent,~,~] = splitDataAdvance(2,mPFCspike,M1spike(:,M1Idx),ev
```

```
GLMsectrainLambdaYpre = GLMmodel(trainX, W);
```

```
GLM_sec_ccList = zeros(1, 1000/10);
```

```
% smooth
```

```
for kernelSize=10:10:1000
```

```
    smoothedLambda = gaussianSmooth(trainY, kernelSize);
```

```
    smoothedLambdaPre = gaussianSmooth(GLMsectrainLambdaYpre, kernelSize);
```

```
    cc = corrcoef(smoothedLambda, smoothedLambdaPre);
```

```
    GLM_sec_ccList(kernelSize/10) = cc(2);
```



```
end
```

```
% ANN
```

```
bestDBR = Inf;
```

```
for i=1:48
```

```
    if (ANN_explore_Nz(13,i).DBR<bestDBR)
```

```
        bestDBR = ANN_explore_Nz(13,i).DBR;
```

```
        W = ANN_explore_Nz(13,i).W;
```

```
        M1Idx = ANN_explore_Nz(13,i).M1Idx;
```

```
    end
```

```
end
```

```
[~,~,~,trainX,~,~,trainY,~,~] = splitDataAdvance(1,mPFCspike,M1spike(:,M1Idx),eventTrain,optima
```

```
[~, Nx] = size(trainX);
```

```
ANNtrainLambdaYpre = ANNmodel(trainX, W, Nx, 13);
```

```
ANNccList = zeros(1, 1000/10);
```

```
% smooth
```

```
for kernelSize=10:10:1000
```

```
    smoothedLambda = gaussianSmooth(trainY, kernelSize);
```

```
    smoothedLambdaPre = gaussianSmooth(ANNtrainLambdaYpre, kernelSize);
```

```
    cc = corrcoef(smoothedLambda, smoothedLambdaPre);
```

```
    ANNccList(kernelSize/10) = cc(2);
```

```
end
```

```
% optimal smooth kernel size result
```

```
kernelSize = 100;
```

```
smoothedLambda = gaussianSmooth(trainY, kernelSize);
```

```
smoothedGLMLambdaPre = gaussianSmooth(GLMtrainLambdaYpre, kernelSize);
```

```
smoothedGLMsecLambdaPre = gaussianSmooth(GLMsectrainLambdaYpre, kernelSize);
```

```
smoothedANNLambdaPre = gaussianSmooth(ANNtrainLambdaYpre, kernelSize);
```

```
% take part of result for display
```

```
% spikeLength = length(trainY);
```

```
index = 4000:6000;
```

```
t = index/100;
```

```
figure(3)
```

```
% real spike
```

```
subplot(4,1,2)
```

```
area(t, trainY(index))
```

```
xlabel("time(sec)")
```

```
set(gca, 'TickLength', [0 0])
```

```
set(gca, 'ytick', [])
```

```
set(gca, 'box', 'off')
```

```
% smoothed results
```

```
subplot(4,1,3)
```

```
hh{1} = plot(t, smoothedLambda(index), 'r');
```

```
hold on
```

```
hh{2} = plot(t, smoothedGLMLambdaPre(index), 'b');
```

```
hh{3} = plot(t, smoothedGLMsecLambdaPre(index), 'g');
```

```
hh{4} = plot(t, smoothedANNLambdaPre(index), 'm');
```

```
hold off
```

```
xlabel("time(sec)")
```

```
ylabel("Firing rate")
```

```
% cc analyze
```

```
subplot(4,1,4)
```

```

plot(0.1:0.1:10, GLMccList, 'b')
hold on
plot(0.1:0.1:10, GLM_sec_ccList, 'g')
plot(0.1:0.1:10, ANNccList, 'm');
hold off
xlabel("kenel size(sec)")
xlim([0 10])
ylabel("CC")
title("CC-kernel size")
legend([hh{1}; hh{2}; hh{3}; hh{4}], "Actual M1 spike", "GLM", "2nd-Order GLM", "Staged Point-Process-Model",
    "Position",[0.5 0.95 0 0], "Box","off", "Orientation","horizontal")
% legend([h{1}; h{2}; h{3}], "Actual M1 spike", "GLM", "2nd-Order GLM", ...
% "Position",[0.5 0.95 0 0], "Box","off", "Orientation","horizontal")
subplot(4,1,1)
area(40:0.01:60, trainEvent(4008:6008))

```

