



ELEC 4700-ASSIGNMENT1

# Monte-Carlo Modeling of Electron Transport

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## Part 1: Electron Modelling

To calculate the thermal energy, it is noted that there are two degrees of freedom for the electrons. Using Maxwell's principle of equipartition of energy,

$$\overline{KE} = \frac{1}{2}kT = 2\left(\frac{1}{2}m\overline{v^2}\right) \Rightarrow \overline{v^2} = \frac{2kT}{m}$$

```
clear all
close all
m0 = 9.10938356e-31; m
= 0.26*m0;
T = 300;
k = 1.38064852e-23;
vth = sqrt(2*k*T/m)
```

```
vth = 1.8702e+05
```

Or 187 km/s. The mean free path,  $l$ , is simply

```
l = vth*0.2e-12
```

```
l = 3.7404e-08
```

Thus, the mean free path is about 37.4 nm.

Here are some variables to control the simulations:

```
height = 100e-9;
length = 200e-9;
population_size = 3000;
plot_population = 10; time_step
= height/vth/100; iterations =
1000;
```

```
show_movie = 0;
```

For the simulations, these arrays will hold information about the state of the system, including the positions, velocities, and temperatures.

```
% Each row corresponds to an electron with the positions and velocities
```

```
% [x y vx vy]
```

```
state = zeros(population_size, 4);
```

```
trajectories = zeros(iterations, plot_population*2); temperature =  
zeros(iterations, 1);
```

Generate an initial population with constant speeds

```
for i = 1:population_size angle
```

```
    = rand*2*pi;
```

```
    state(i,:) = [length*rand height*rand vth*cos(angle)
```

```
    vth*sin(angle)];
```

```
end
```

Iterate over time and update the positions, while plotting the state.

```
for i = 1:iterations
```

```
    state(:, 1:2) = state(:, 1:2) + time_step.*state(:, 3:4);
```

```
    % Look for collisions with the boundaries j =
```

```
    state(:, 1) > length;
```

```
    state(j, 1) = state(j, 1) - length;
```

```
    j = state(:, 1) < 0;
```

```
    state(j, 1) = state(j, 1) + length;
```

```
    j = state(:, 2) > height;
```

```
    state(j, 2) = 2*height - state(j, 2); state(j, 4) =
```

```
    -state(j, 4);
```

```
    j = state(:, 2) < 0; state(j, 2) = -
```

```
    state(j, 2);
```

```
    state(j, 4) = -state(j, 4);
```

```
    temperature(i) = (sum(state(:, 3).^2) + sum(state(:, 4).^2))*m/k/2/population_size;
```

```
    % Record the trajectories for
```

```
    j = 1:plot_population
```

```
        trajectories(i, (2*j):(2*j+1)) = state(j, 1:2);
```

```
    end
```

```
    % Update the movie every 5 iterations if
```

```
    show_movie && mod(i, 5) == 0
```

```
        figure(1);
```

```
        subplot(2, 1, 1);
```

```
hold off;  
plot(state(1:plot_population,1)./1e-9,  
state(1:plot_population,2)./1e-9, 'o');  
axis([0 length/1e-9 0 height/1e-9]);
```

```

        title(sprintf('Trajectories for %d of %d Electrons with FixedVelocity (Part
1)',...
        plot_population, population_size));xlabel('x
(nm)');
        ylabel('y (nm)');if i >
        1
            subplot(2,1,2);
            hold off;
            plot(time_step*(0:i-1), temperature(1:i));
            axis([0 time_step*iterations min(temperature)*0.98
max(temperature)*1.02]);
            title('Semiconductor Temperature');
            xlabel('Time (s)'); ylabel('Temperature
(K)');
        end
        pause(0.05);
    end
end

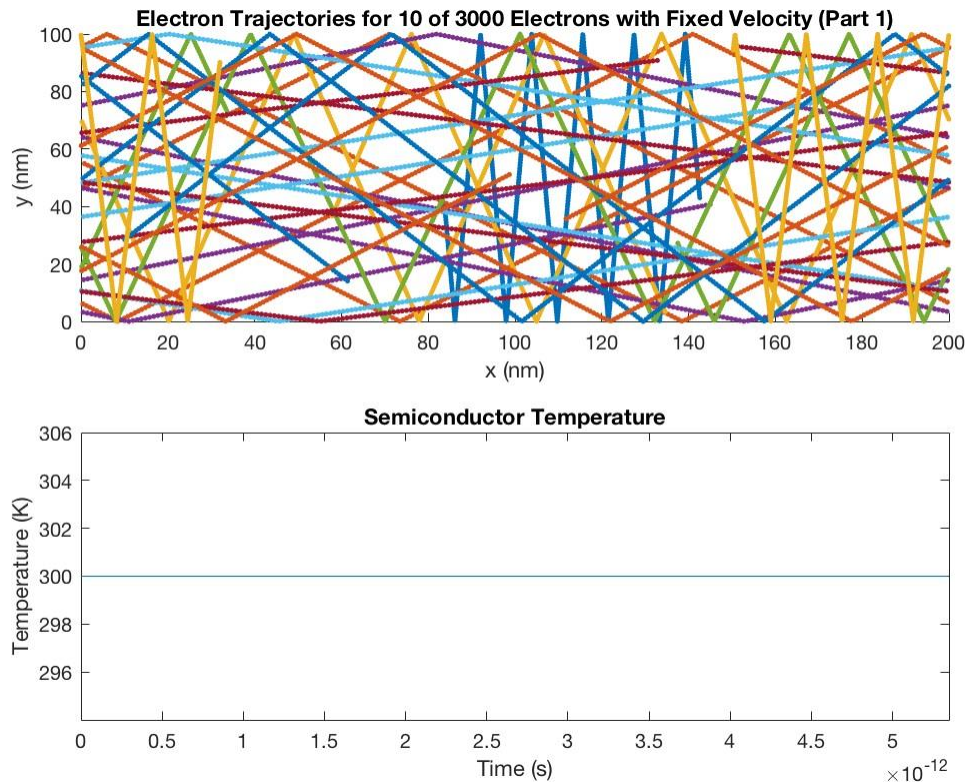
```

```

% Show trajectories after the movie is overfigure(1);
subplot(2,1,1);
title(sprintf('Electron Trajectories for %d of %d Electrons with FixedVelocity (Part
1)',...
        plot_population, population_size));xlabel('x
(nm)');
        ylabel('y (nm)');
        axis([0 length/1e-9 0 height/1e-9]);hold on;
        for i=1:plot_population
            plot(trajectories(:,i*2)./1e-9, trajectories(:,i*2+1)./1e-9, '.');
        end

        if(~show_movie)
            subplot(2,1,2);
            hold off;
            plot(time_step*(0:iterations-1), temperature); axis([0
time_step*iterations min(temperature)*0.98
max(temperature)*1.02]); title('Semiconductor
Temperature');xlabel('Time (s)');
            ylabel('Temperature (K)');
        end
end

```



## Part 2: Collisions with Mean Free Path

For the second simulation, the initial velocities are assigned based on a Maxwell-Boltzmann distribution, and scattering is modelled. First, calculate the scattering probability in one time step:

$$p_{\text{scat}} = 1 - \exp(-\text{time\_step}/0.2\text{e-}12)$$

$$p_{\text{scat}} =$$

$$0.0264$$

The distribution of velocities in x and y is Gaussian, with a standard deviation of  $\sqrt{kT/m}$ . This results in an overall Maxwell-Boltzmann velocity distribution at temperature T

$$v_{\text{pdf}} = \text{makedist}(\text{'Normal'}, \text{'mu'}, 0, \text{'sigma'}, \text{sqrt}(k*T/m));$$

The initial population is generated using this distribution:

$$\begin{aligned} \text{for } i = 1:\text{population\_size} \\ \text{angle} = \text{rand} * 2 * \pi; \end{aligned}$$

```
state(i,:) = [length*rand height*rand random(v_pdf)
random(v_pdf)];
end
```

The average velocity should be calculated to be correct:

```
avg_v = sqrt(sum(state(:,3).^2)/population_size + ...
             sum(state(:,4).^2)/population_size)
```

```
avg_v =
```

```
1.8836e+05
```

This returns a velocity of about 187 km/s, which is correct. This varies a little bit, since the initial velocities are random with a MB distribution.

The second simulation loop follows:

```
for i = 1:iterations
    % Update positions
    state(:,1:2) = state(:,1:2) + time_step.*state(:,3:4);

    j = state(:,1) > length; state(j,1) =
        state(j,1) - length;

    j = state(:,1) < 0;
    state(j,1) = state(j,1) + length;

    j = state(:,2) > height;
    state(j,2) = 2*height - state(j,2); state(j,4) =
        -state(j,4);

    j = state(:,2) < 0; state(j,2) = -
        state(j,2);
    state(j,4) = -state(j,4);

    % Scatter particles
    j = rand(population_size, 1) < p_scatter; state(j,3:4) =
        random(v_pdf, [sum(j),2]);

    % Record the temperature
    temperature(i) = (sum(state(:,3).^2) + sum(state(:,4).^2))*m/k/2/population_size;

    % Record positions for subset of particles that will be graphed
    j=1:plot_population
    trajectories(i, (2*j):(2*j+1)) = state(j, 1:2);
end

% Update the movie every 5 iterations
if show_movie && mod(i,5) == 0
    figure(2);
    subplot(3,1,1);
```



```
hold off;  
plot(state(1:plot_population,1)./1e-9,  
state(1:plot_population,2)./1e-9, 'o');  
axis([0 length/1e-9 0 height/1e-9]); title(sprintf('Trajectories for %d  
of %d Electrons (Part  
2)',...
```

```

        plot_population, population_size)); xlabel('x
        (nm)');
        ylabel('y (nm)'); if i >
        1
            subplot(3,1,2);
            hold off;
            plot(time_step*(0:i-1), temperature(1:i));
            axis([0 time_step*iterations min(temperature)*0.98
max(temperature)*1.02]);
            title('Semiconductor Temperature');
            xlabel('Time (s)'); ylabel('Temperature
            (K)');
        end

        % Show histogram of speeds
        subplot(3,1,3);
        v = sqrt(state(:,3).^2 + state(:,4).^2);
        title('Histogram of Electron Speeds');
        histogram(v);
        xlabel('Speed (m/s)');
        ylabel('Number of particles');

        pause(0.05);
    end
end

% Show trajectories after the movie is over figure(2);
subplot(3,1,1);
title(sprintf('Trajectories for %d of %d Electrons (Part 2)',...plot_population,
population_size));
xlabel('x (nm)');
ylabel('y (nm)');
axis([0 length/1e-9 0 height/1e-9]); hold on;
for i=1:plot_population
    plot(trajectories(:,i*2)/1e-9, trajectories(:,i*2+1)/1e-9, '.');
end

% Show temperature plot over time
if(~show_movie)
    subplot(3,1,2);
    hold off;
    plot(time_step*(0:iterations-1), temperature); axis([0
time_step*iterations min(temperature)*0.98
max(temperature)*1.02]); title('Semiconductor
Temperature'); xlabel('Time (s)');
ylabel('Temperature (K)');

```

```
end
```

```
% Show speed histogram
```

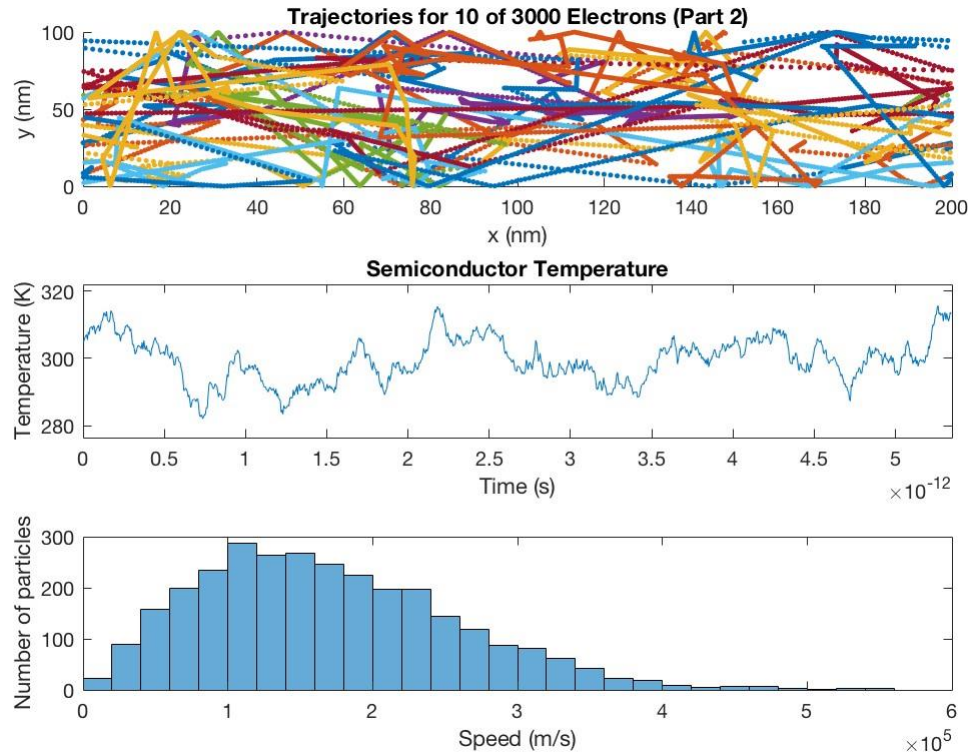
```
subplot(3,1,3);
```

```
v = sqrt(state(:,3).^2 + state(:,4).^2);
```

```

title('Histogram of Electron Speeds');
histogram(v);
xlabel('Speed (m/s)');
ylabel('Number of particles');

```



This second simulation shows that the average temperature fluctuates over time due to the scattering, but it has an average of 300K over time.

## Part 3: Enhancements

Here, the boundaries can be set to be specular or diffusive. If they are diffusive, the electrons bounce off at a random angle rather than one symmetrical about the normal with the boundary.

The non-periodic top and bottom boundaries can be set to be either specular (1) or diffusive (0) with the following parameters:

```

top_specular = 0;
bottom_specular = 0;

```

This simulation also includes boxes (obstacles). Also, each box can separately be set to be specular (1) or diffusive (0)

```

% The values are [xmin xmax ymin ymax] for each box
boxes = 1e-9.*[80 120 0 40; 80 120 60 100];

```

```
boxes_specular = [0 1];
```

```
% Generate an initial population
```

```

for i = 1:population_sizeangle
    = rand*2*pi;
    state(i,:) = [length*rand height*rand random(v_pdf)
random(v_pdf)];

    % Make sure no particles start in a box
    while(in_box(state(i,1:2), boxes))
        state(i,1:2) = [length*rand height*rand];
    end
end
end

```

Run through the third simulation:

```

for i = 1:iterations
    state(:,1:2) = state(:,1:2) + time_step.*state(:,3:4);

    j = state(:,1) > length; state(j,1) =
state(j,1) - length;

    j = state(:,1) < 0;
state(j,1) = state(j,1) + length;j =

state(:,2) > height;

    if(top_specular)
        state(j,2) = 2*height - state(j,2);state(j,4) =
-state(j,4);
    else % Diffusive
        % The electron bounces off at a random anglestate(j,2)
= height;
        v = sqrt(state(j,3).^2 + state(j,4).^2);angle =
rand([sum(j,1])*2*pi; state(j,3) = v.*cos(angle);
state(j,4) = -abs(v.*sin(angle));
    end

    j = state(:,2) < 0;

    if(bottom_specular)
        state(j,2) = -state(j,2);
        state(j,4) = -state(j,4);else %
Diffusive
        % The electron bounces off at a random anglestate(j,2)
= 0;
        v = sqrt(state(j,3).^2 + state(j,4).^2);angle =
rand([sum(j,1])*2*pi; state(j,3) = v.*cos(angle);
state(j,4) = abs(v.*sin(angle));
    end
end

```

```
% Look for particles that have "entered" a box and move them to  
% where they should be.for  
j=1:population_size  
    box_num = in_box(state(j,1:2), boxes);
```

```

while(box_num ~= 0)
    % To see which side the electron collided with,
    % find which one it's closer to
    x_dist = 0;
    new_x = 0;
    if(state(j,3) > 0)
        x_dist = state(j,1) - boxes(box_num,1); new_x =
        boxes(box_num,1);
    else
        x_dist = boxes(box_num,2) - state(j,1); new_x =
        boxes(box_num,2);
    end

    y_dist = 0;
    new_y = 0;
    if(state(j,4) > 0)
        y_dist = state(j,2) - boxes(box_num, 3); new_y =
        boxes(box_num, 3);
    else
        y_dist = boxes(box_num, 4) - state(j,2); new_y =
        boxes(box_num, 4);
    end

    if(x_dist < y_dist)
        state(j,1) = new_x;
        if(~boxes_specular(box_num))
            sgn = -sign(state(j,3));
            v = sqrt(state(j,3).^2 + state(j,4).^2); angle =
            rand()*2*pi;
            state(j,3) = sgn.*abs(v.*cos(angle)); state(j,4) =
            v.*sin(angle);
        else % Specular
            state(j,3) = -state(j,3);
        end
    else
        state(j,2) = new_y;
        if(~boxes_specular(box_num))
            sgn = -sign(state(j,4));
            v = sqrt(state(j,3).^2 + state(j,4).^2); angle =
            rand()*2*pi;
            state(j,3) = v.*cos(angle); state(j,4) =
            sgn.*abs(v.*sin(angle));
        else % Specular
            state(j,4) = -state(j,4);
        end
    end
end

```



```

        end
    end

    box_num = in_box(state(j,1:2), boxes);
end

% Scatter particles
j = rand(population_size, 1) < p_scatter;

```

```

state(j,3:4) = random(v_pdf, [sum(j),2]);

% Record the temperature
temperature(i) = (sum(state(:,3).^2) + sum(state(:,4).^2))*m/k/2/population_size;

% Record positions for subset of particles that will be graphed
for j=1:plot_population
    trajectories(i, (2*j):(2*j+1)) = state(j, 1:2);
end

% Update the movie every 5 iterations
if show_movie && mod(i,5) == 0
    figure(3);
    subplot(3,1,1);
    hold off;
    plot(state(1:plot_population,1)./1e-9,
state(1:plot_population,2)./1e-9, 'o');
    hold on;

    % Plot the boxes
    for j=1:size(boxes,1)
        plot([boxes(j, 1) boxes(j, 1) boxes(j, 2) boxes(j, 2)
boxes(j, 1)]./1e-9,...
            [boxes(j, 3) boxes(j, 4) boxes(j, 4) boxes(j, 3)
boxes(j, 3)]./1e-9, 'k-');
end

    axis([0 length/1e-9 0 height/1e-9]); title(sprintf('Trajectories for %d
3)',...
of %d Electrons (Part

    plot_population, population_size)); xlabel('x
(nm)');
    ylabel('y (nm)');
    if i > 1
        subplot(3,1,2);
        hold off;
        plot(time_step*(0:i-1), temperature(1:i));
        axis([0 time_step*iterations min(temperature(1:i))*0.98
max(temperature)*1.02]);
        title('Semiconductor Temperature');
        xlabel('Time (s)'); ylabel('Temperature
(K)');
    end

    subplot(3,1,3);
    v = sqrt(state(:,3).^2 + state(:,4).^2);
    title('Histogram of Electron Speeds');
    histogram(v);

```

```
xlabel('Speed (m/s)');  
ylabel('Number of particles');  
  
pause(0.05);  
end
```

```

end

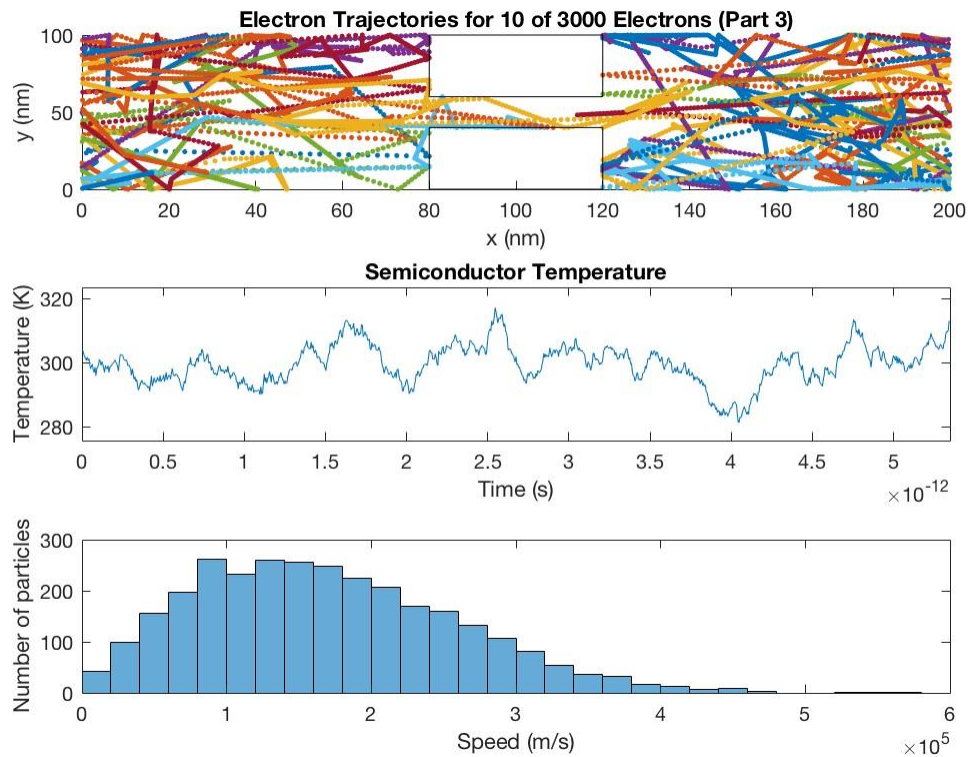
% Show trajectories after the movie is over
figure(3);
subplot(3,1,1);
title(sprintf('Electron Trajectories for %d of %d Electrons (Part3)',...
    plot_population, population_size)); xlabel('x
(nm)');
ylabel('y (nm)');
axis([0 length/1e-9 0 height/1e-9]); hold on;
for i=1:plot_population
    plot(trajectories(:,i*2)./1e-9, trajectories(:,i*2+1)./1e-9, 'r');
end

% Plot the boxes
for j=1:size(boxes,1)
    plot([boxes(j, 1) boxes(j, 1) boxes(j, 2) boxes(j, 2) boxes(j,1)]./1e-9,...
        [boxes(j, 3) boxes(j, 4) boxes(j, 4) boxes(j, 3) boxes(j,3)]./1e-9, 'k-');
end

% Plot temperature
if(~show_movie)
    subplot(3,1,2);
    hold off;
    plot(time_step*(0:iterations-1), temperature); axis([0
    time_step*iterations min(temperature)*0.98
    max(temperature)*1.02]); title('Semiconductor
    Temperature'); xlabel('Time (s)');
    ylabel('Temperature (K)');
end

subplot(3,1,3);
v = sqrt(state(:,3).^2 + state(:,4).^2);
title('Histogram of Electron Speeds');
histogram(v);
xlabel('Speed (m/s)');
ylabel('Number of particles');

```



For the final simulation, an electron density map is created, by creating a 2D histogram over space:

```
density = hist3(state(:,1:2),[200 100])';
```

```
% Smooth out the electron density map N =
```

```
20;
```

```
sigma = 3;
```

```
[x y]=meshgrid(round(-N/2):round(N/2), round(-N/2):round(N/2));f=exp(-  
x.^2/(2*sigma^2)-y.^2/(2*sigma^2));
```

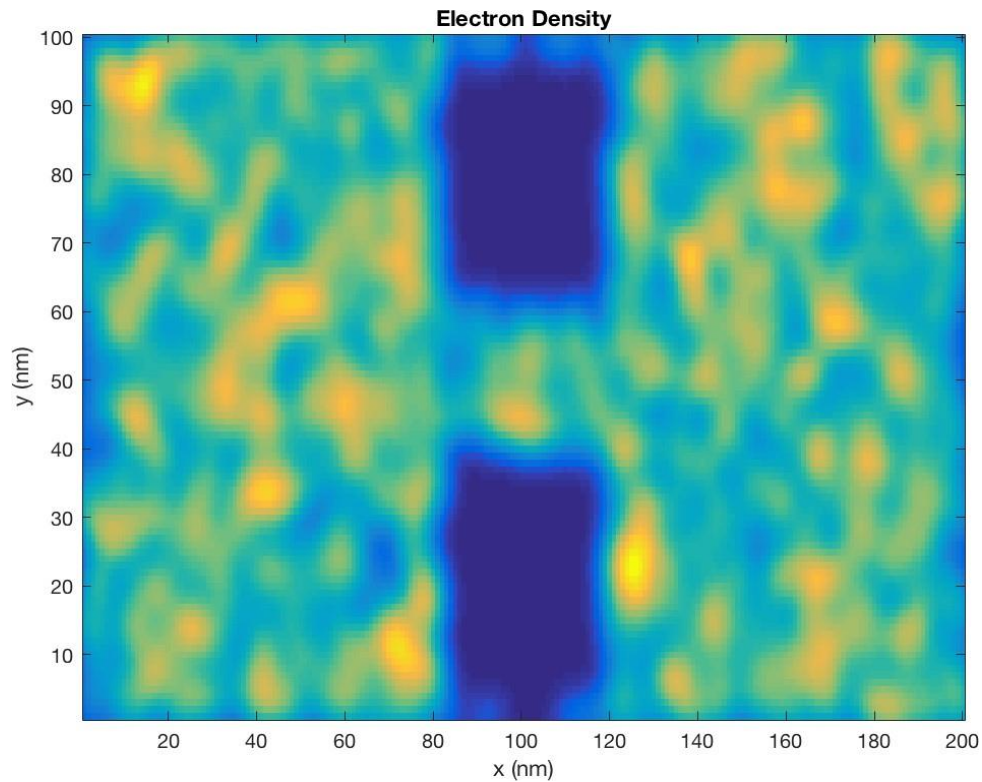
```
f=f./sum(f(:));
```

```
figure(4);
```

```
imagesc(conv2(density,f,'same'));
```

```
set(gca,'YDir','normal'); title('Electron  
Density'); xlabel('x (nm)');
```

```
ylabel('y (nm)');
```



The temperature map is created using a similar procedure. The electron velocities are put into bins overspace to calculate the temperature at different points:

```
temp_sum_x = zeros(ceil(length/1e-9),ceil(height/1e-9));temp_sum_y
=      zeros(ceil(length/1e-9),ceil(height/1e-9));    temp_num      =
zeros(ceil(length/1e-9),ceil(height/1e-9));
```

```
% Look at velocities of all the particlesfor
i=1:population_size
    % Find which "bin" it belongs in:x =
    floor(state(i,1)/1e-9);
    y = floor(state(i,2)/1e-9);if(x==0)
        x = 1;
    end
    if(y==0)
        y= 1;
    end

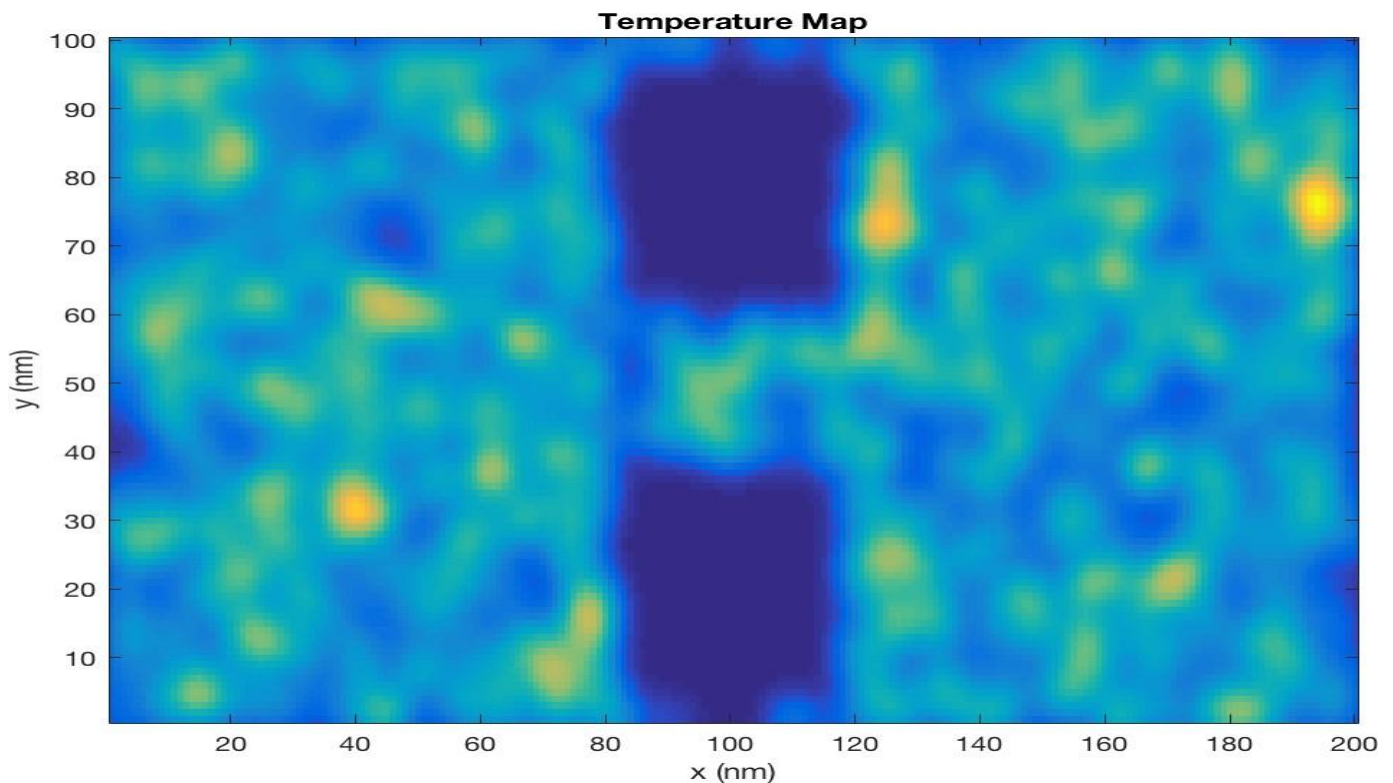
    % Add its velocity components to the cumulative count:
    temp_sum_y(x,y) = temp_sum_y(x,y) + state(i,3)^2;
    temp_sum_x(x,y) = temp_sum_x(x,y) + state(i,4)^2;
    temp_num(x,y) = temp_num(x,y) + 1;
end
```

Now, with the velocities added up, calculate the temperatures:

```
temp = (temp_sum_x + temp_sum_y).*m./k./2./temp_num;
temp(isnan(temp)) = 0;
temp = temp';
```

Like with the density map, perform some smoothing:

```
N = 20;
sigma = 3;
[x y]=meshgrid(round(-N/2):round(N/2), round(-N/2):round(N/2));f=exp(-
x.^2/(2*sigma^2)-y.^2/(2*sigma^2));
f=f./sum(f(:));
figure(5);
imagesc(conv2(temp,f,'same'));
set(gca,'YDir','normal');
title('Temperature Map'); xlabel('x
(nm)');
ylabel('y (nm)');
```



The relationship between the temperature map and the electron density map is very noticeable. However, some of the electrons have considerably higher speeds, and this can be seen on the temperature map.