

## Project 2

### Computational Neuroscience EC60007

#### 1. Consistent units

1. Time - ms

$$\text{current/area} = \mu\text{A}/\text{cm}^2$$

$$\text{Voltage} = \text{mV}$$

$$\text{Capacitance/area} = \mu\text{F}/\text{cm}^2$$

$$\text{Conductance/area} = \text{mS}/\text{cm}^2$$

$$\begin{aligned} \text{mV} &= 10^{-3} \text{ V} \\ \mu\text{A}/\text{ms} &= 10^{-3} \text{ A/s} = 10^{-3} \text{ V} \end{aligned} \quad \left. \vphantom{\begin{aligned} \text{mV} &= 10^{-3} \text{ V} \\ \mu\text{A}/\text{ms} &= 10^{-3} \text{ A/s} = 10^{-3} \text{ V} \end{aligned}} \right\} \text{consistent}$$

$$\text{charge} = \text{current} \times \text{time} = \mu\text{A} \times \text{ms} = 10^{-9} \text{ C}$$

$$\text{capacitance} \times \text{voltage} = \mu\text{F} \times \text{mV} = 10^{-9} \text{ (FV)}$$

$$\text{resistance} = \text{k}\Omega = 10^3 \Omega = \frac{1}{\text{S} \times 10^{-3}} = \frac{1}{\text{conductance}}$$

These were a consistent set of units

Specify conductance/area as  $\mu\text{S}/\text{cm}^2$

Then if we choose current = nA, area =  $\text{cm}^2$

$$\text{voltage} = \frac{\text{nA}/\text{cm}^2}{\mu\text{S}/\text{cm}^2} = \text{mV}$$

$$\text{time} = \text{ms}$$

$$\text{charge} = \text{nA} \cdot \text{ms} = \text{pC}$$

$$\text{conductance} = \mu\text{S}$$

$$\text{resistance} = 10^6 \Omega$$

$$\text{capacitance} = \frac{\text{pC}}{\text{mV}} = \text{nF}$$

So,

$$\text{ms}$$

$$\text{nA}/\text{cm}^2$$

$$\text{mV}$$

$$\text{nF}/\text{cm}^2$$

$$\mu\text{S}/\text{cm}^2$$

} are the new consistent set of units.

\* Solution is NOT unique

choose current as  $\mu\text{A}$

$$\text{area} = \text{cm}^2$$

$$\text{Voltage} = \frac{\mu\text{A}/\text{cm}^2}{\mu\text{S}/\text{cm}^2} = \text{Volts (V)}$$

$$\text{time} = \text{ms}$$

$$Q = \mu\text{A} \cdot \text{ms} = \text{pC}$$

$$\text{conductance} = \mu\text{S}$$

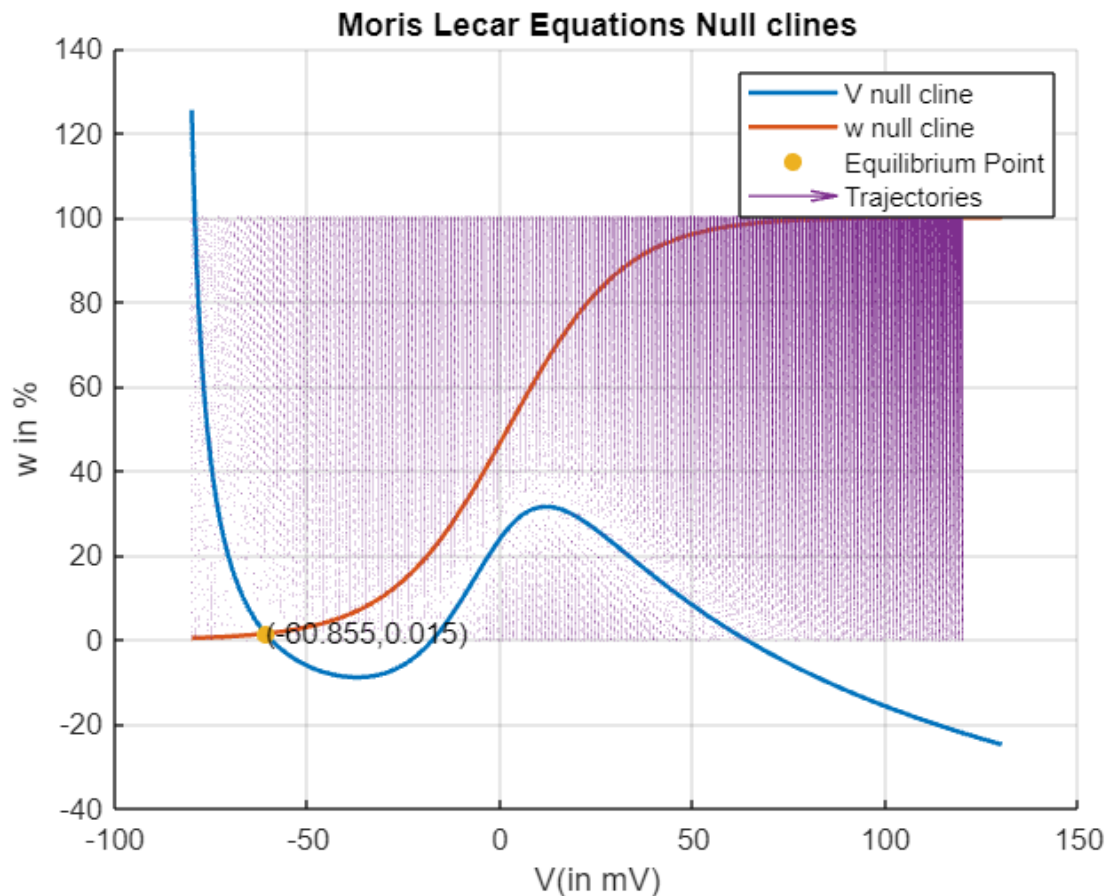
$$\text{resistance} = \text{G}\Omega$$

$$\text{capacitance} = \frac{\text{pC}}{\text{V}} = \text{pF}$$

$$\text{area} = \text{cm}^2$$

→  $\left. \begin{array}{l} \text{ms} \\ \mu\text{A}/\text{cm}^2 \\ \text{pF}/\text{cm}^2 \\ \mu\text{S}/\text{cm}^2 \end{array} \right\}$  is another set of consistent units.

2. Equilibrium point calculated using intersection of the V null cline and w null cline



Equilibrium membrane potential : -60.855 mV

Equilibrium w : 1.5%

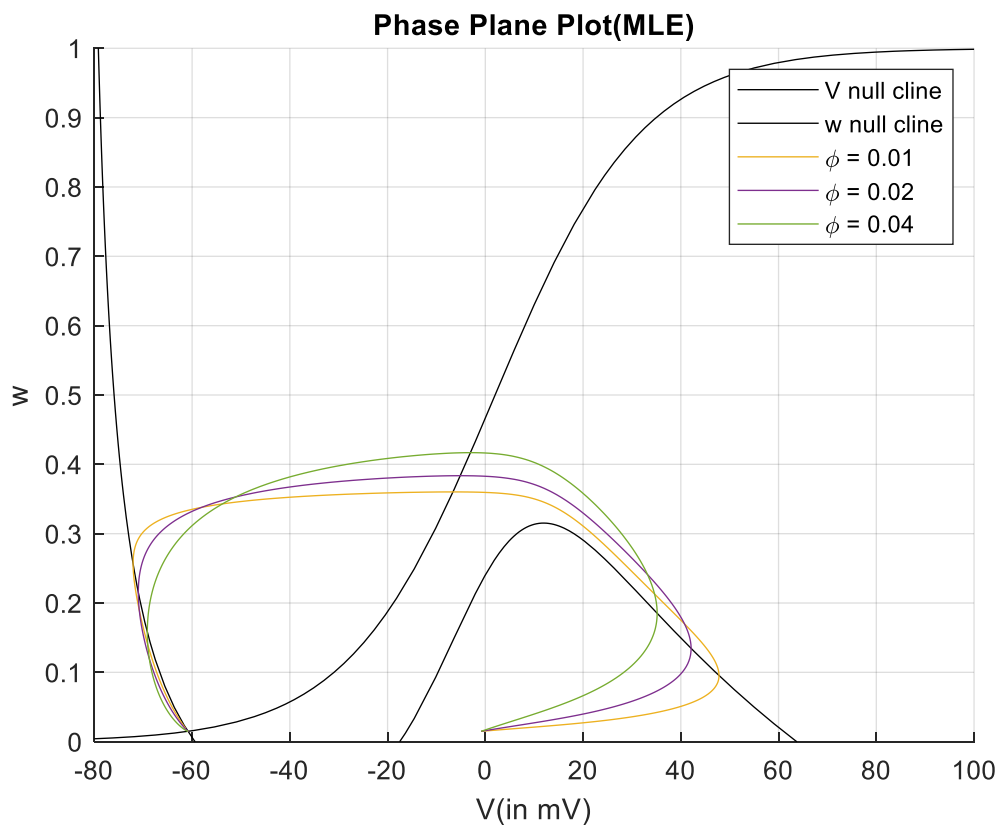
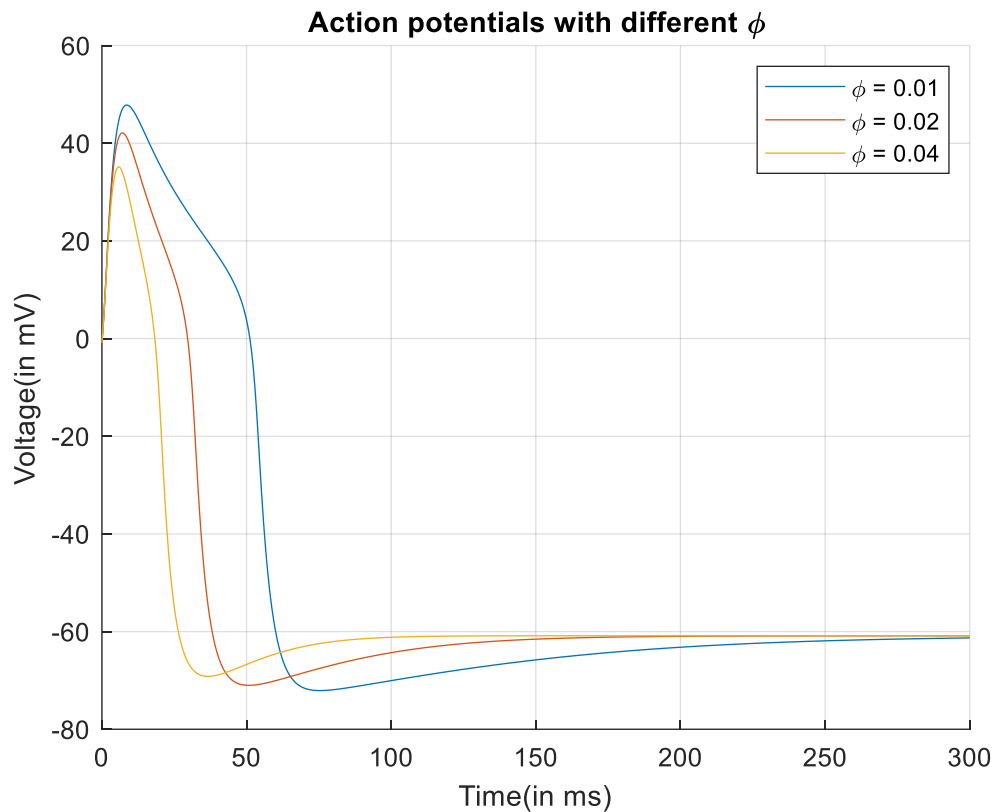
3. Stability analysis using Jacobian

The eigen values are -9.588030e-02 and -3.656140e-02

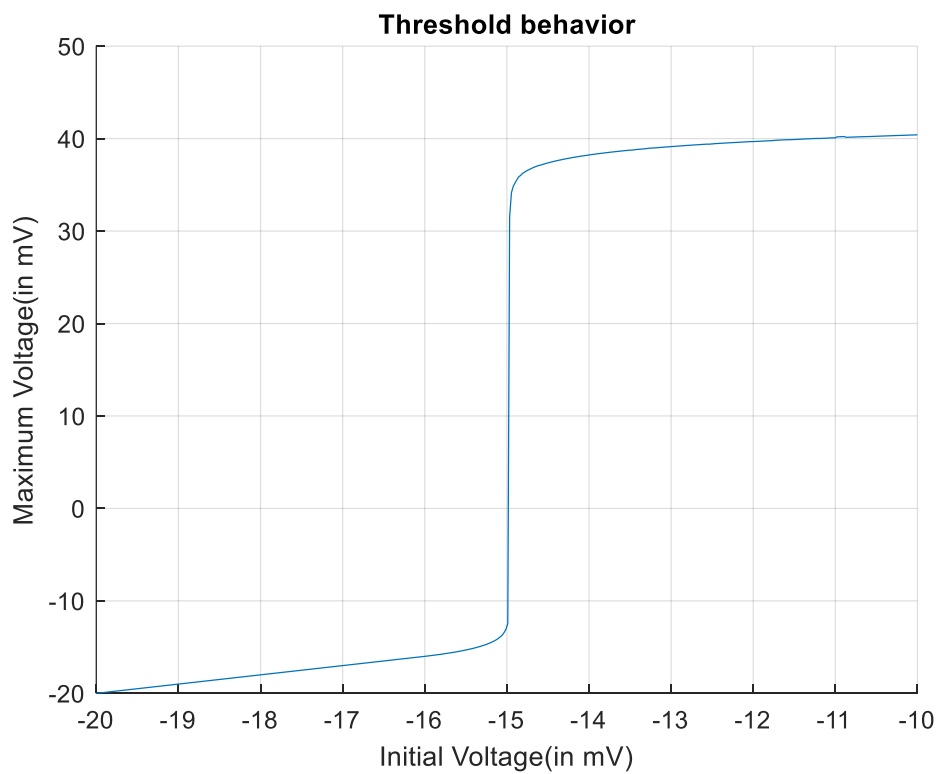
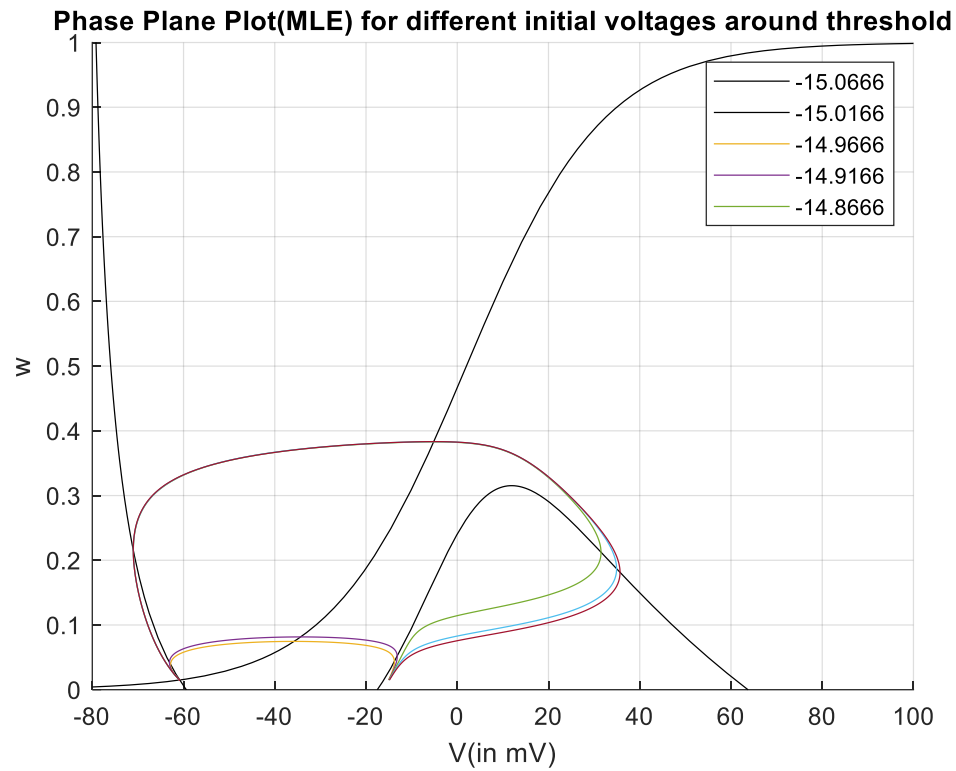
Both  $< 0$  : stable

4. Absolute tolerance does not consider the actual value taken by the variables. Membrane potential is in mV so  $10^{-6}$  absolute tolerance = 1uV error. This is 0.1% error and acceptable. Relative tolerance of  $10^{-3}$  is the maximum ratio of error to value. 0.1% is acceptable. If voltage is measured in kV, then absTol needs to decrease by a factor of  $10^9$  to measure mV voltage with 0.1% maximum error. RelTol does not need to be changed since it considers the actual value taken by the variables.

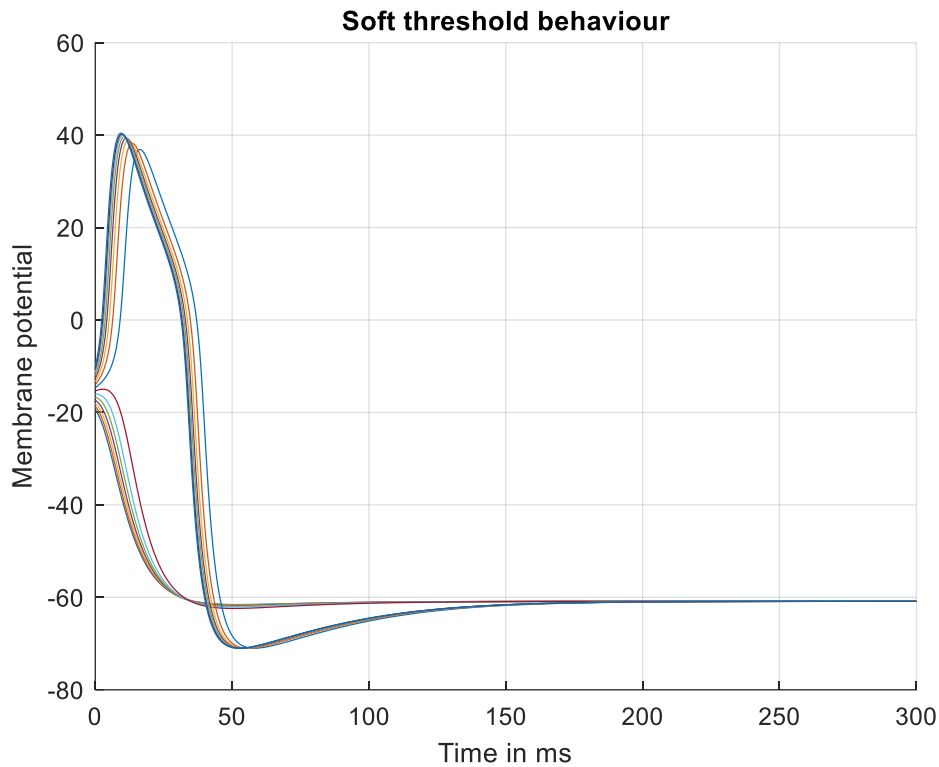
5.  $\phi$  increases with temperature.  $dw/dt$  is proportional to  $\phi$ . Increasing  $\phi$  results in a slower relative increase in the membrane potential with increase in current injection. This agrees with the experimental result that the threshold behaviour becomes graded at higher temperatures, not true threshold behaviour. This explanation is confirmed by the spike being highest for lowest value of  $\phi$ . (lowest temperature).



6. Threshold voltage is -14.966592 mV



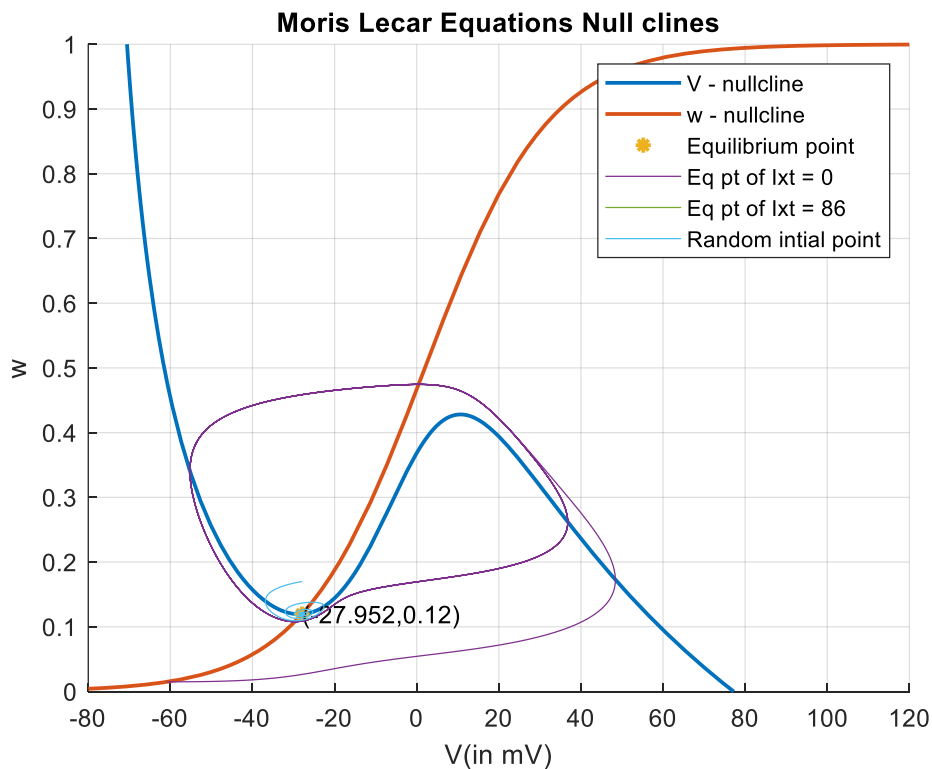
This is not a true threshold as the peak voltage continues to increase as depolarization is increased.



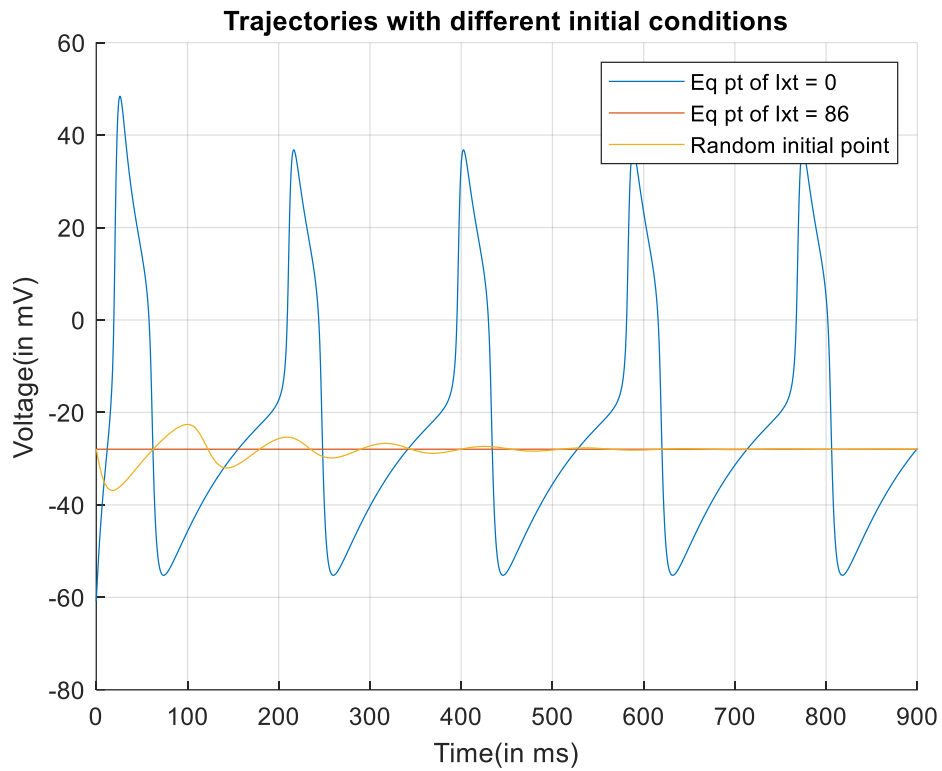
7. 86  $\mu\text{A}/\text{cm}^2$  dc current injection

The equilibrium point is located at (-27.95241 mV, 11.95364 %)

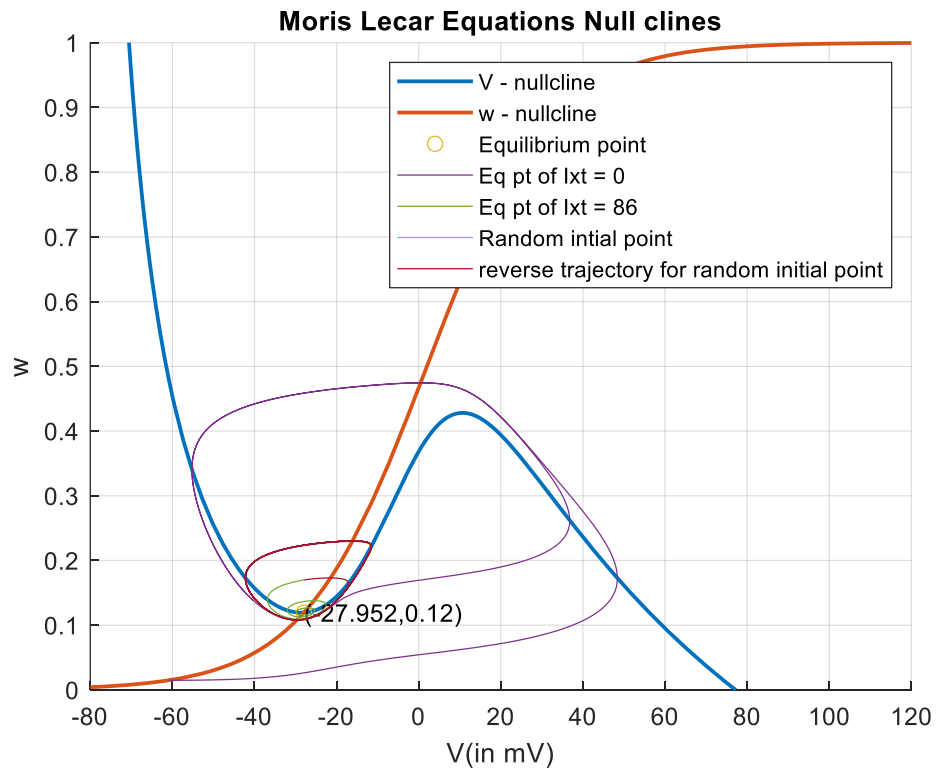
The real parts of eigen values are -6.784560e-03 and -6.784560e-03 : stable



1. The initial condition is outside the unstable periodic orbit so it ends in a stable periodic orbit which is the limit cycle. (purple trajectory)
2. The initial condition is the equilibrium point so there is no change in state
3. The initial condition is inside the unstable periodic orbit so the state spirals inwards. (blue trajectory)



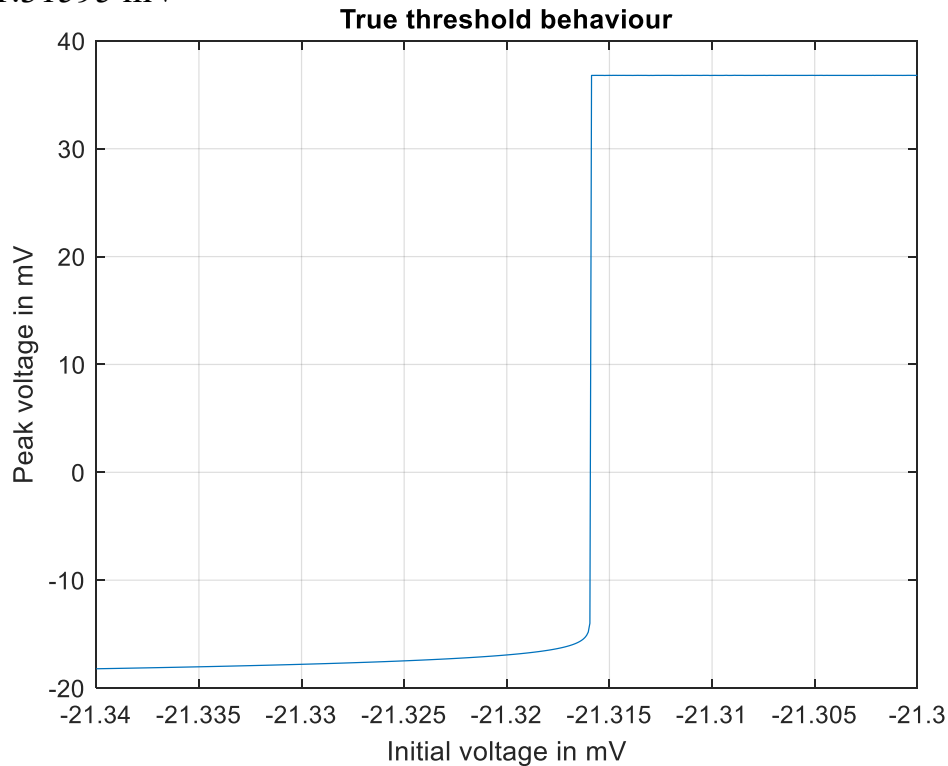
## 8. Unstable Periodic Orbit



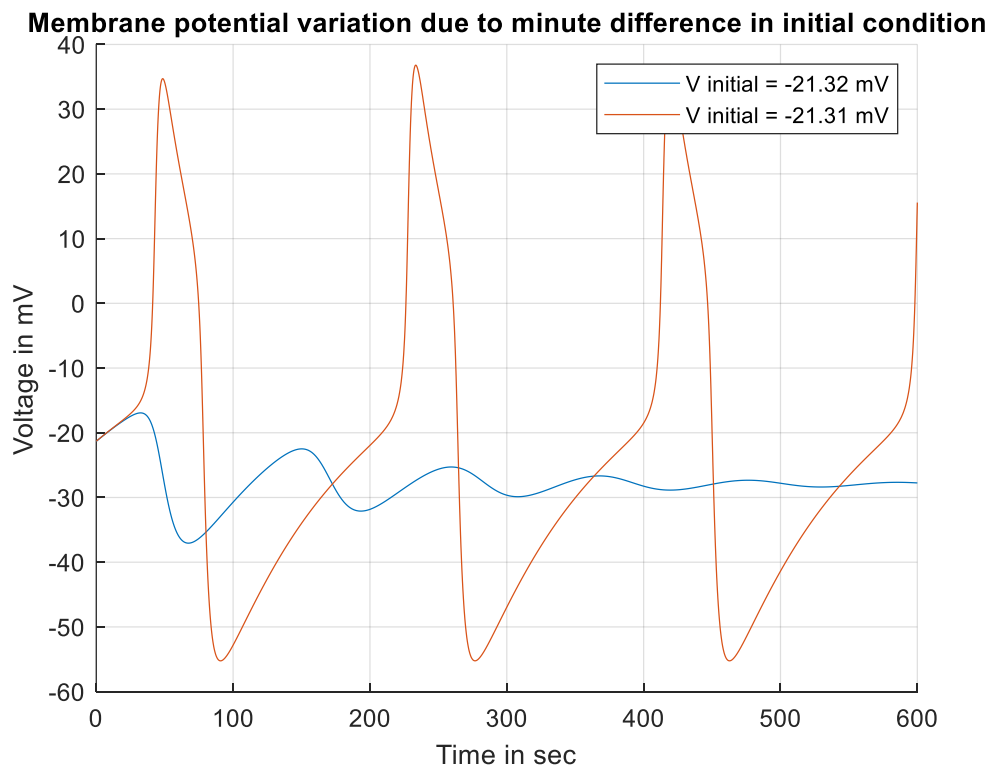
The red loop is the UPO found by running the sim backwards in time.

It shows true threshold behaviour

Threshold: -21.31595 mV



The peak voltage increases sharply at the threshold then remains constant.



When time is reversed the stable points become unstable and vice versa. The null clines and hence the location of the equilibrium points remain unchanged. The unstable and stable manifolds at saddle nodes are exchanged.

9.

----- Part 9 ->  $I_{ext} = 80 \text{ uA/cm}^2$ -----

The equilibrium point is located at  $(-2.996618e+01, 1.061127e-01)$

The eigen values are  $-0.017784+0.055717i$  ,  $-0.017784-0.055717i$

Stable spiral

----- Part 9 ->  $I_{ext} = 86 \text{ uA/cm}^2$ -----

The equilibrium point is located at  $(-2.795241e+01, 1.195364e-01)$

The eigen values are  $-0.006785+0.057427i$  ,  $-0.006785-0.057427i$

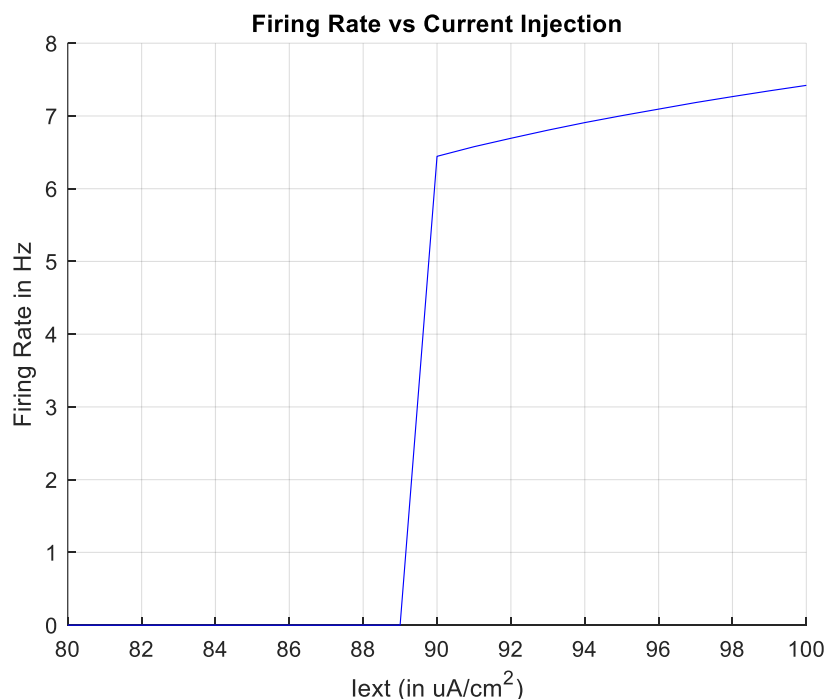
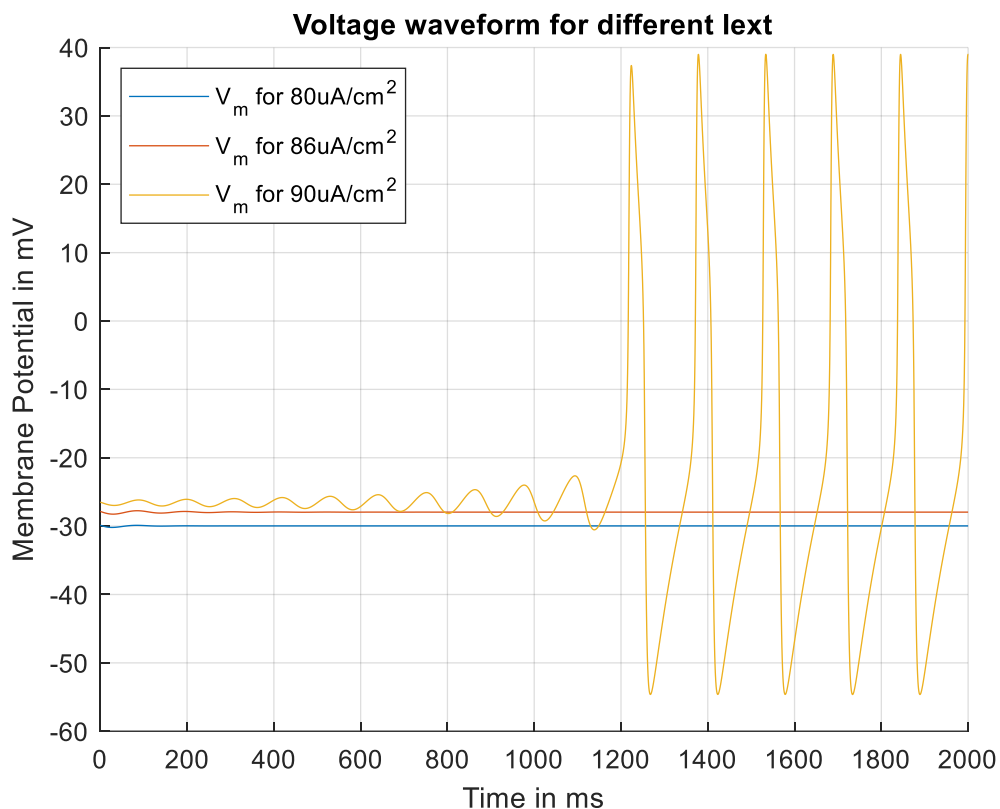
Stable spiral

----- Part 9 ->  $I_{ext} = 90 \text{ uA/cm}^2$ -----

The equilibrium point is located at  $(-2.659687e+01, 1.293793e-01)$

The eigen values are  $0.001753+0.057170i$  ,  $0.001753-0.057170i$

Unstable spiral ending on a limit cycle





## 10. Saddle point

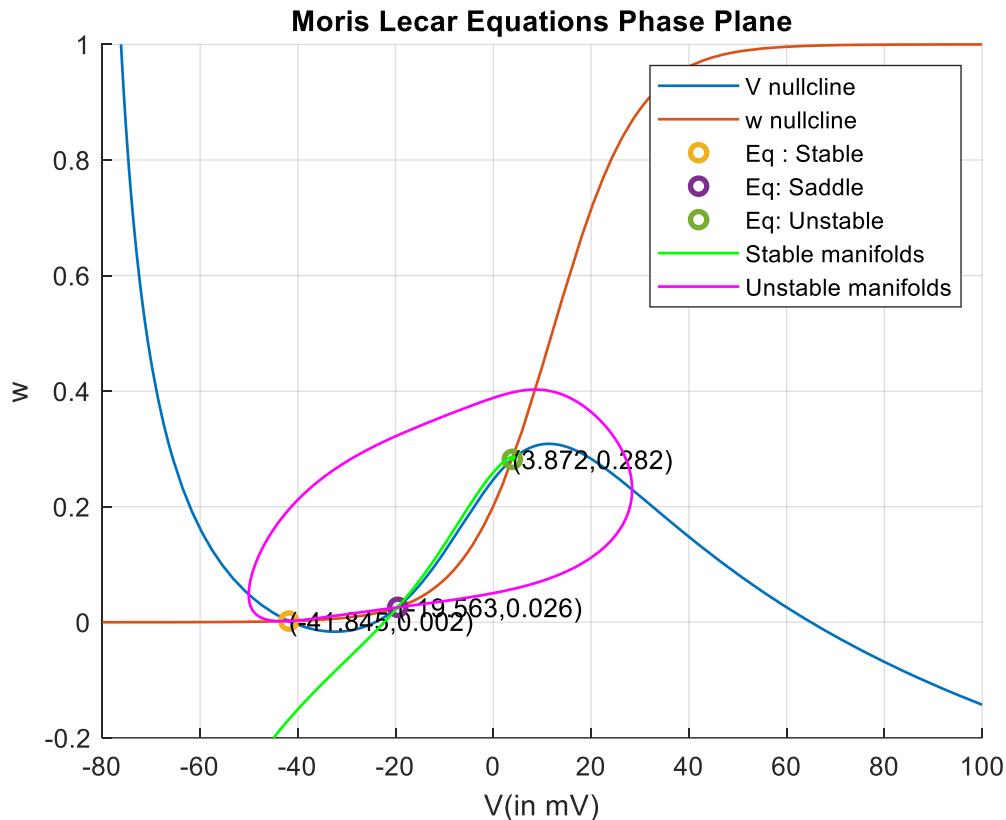
Equilibrium points are :

1.  $(-41.845162, 0.002047)$  : stable
2.  $(-19.563243, 0.025883)$  : saddle
3.  $(3.871510, 0.282051)$  : unstable spiral

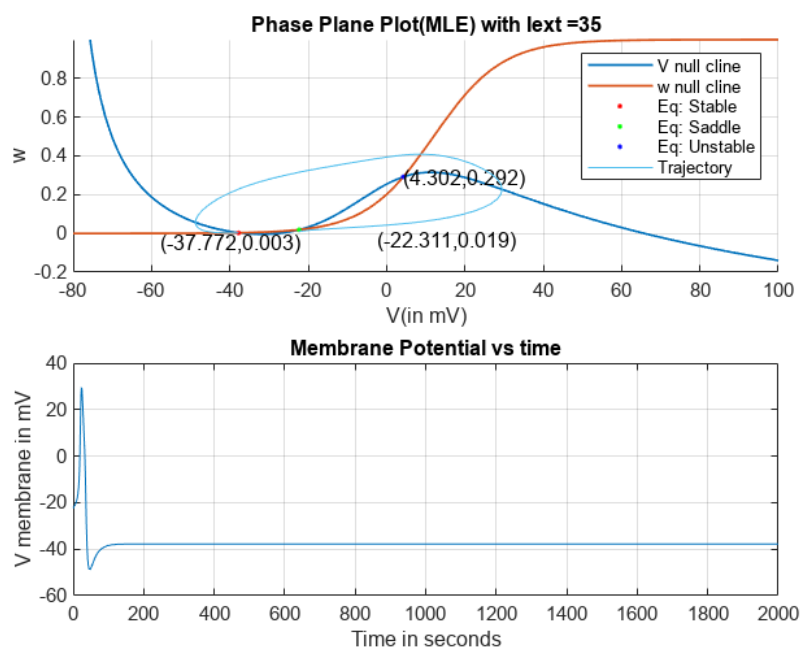
Equilibrium point 1 : The eigen values are  $-0.071544+0.000000i$  ,  $-0.156766+0.000000i$

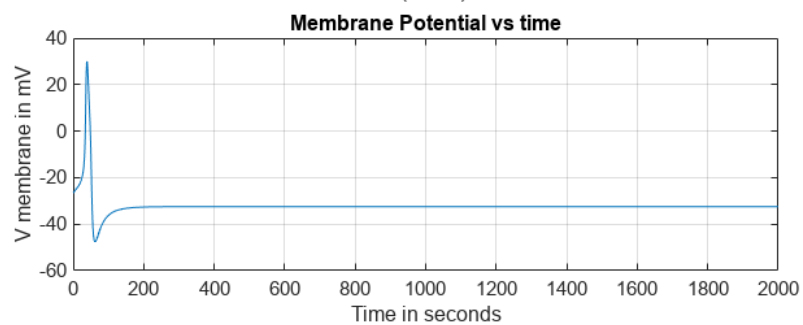
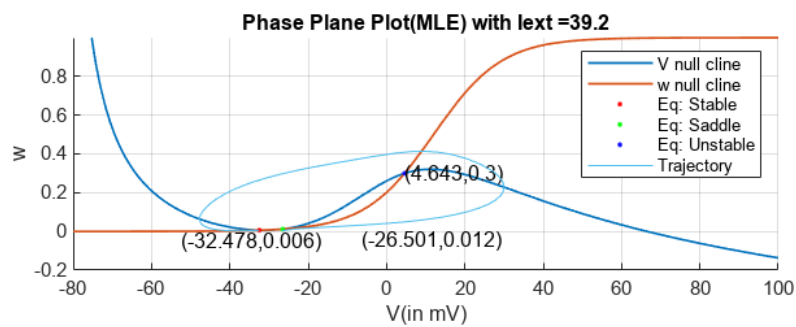
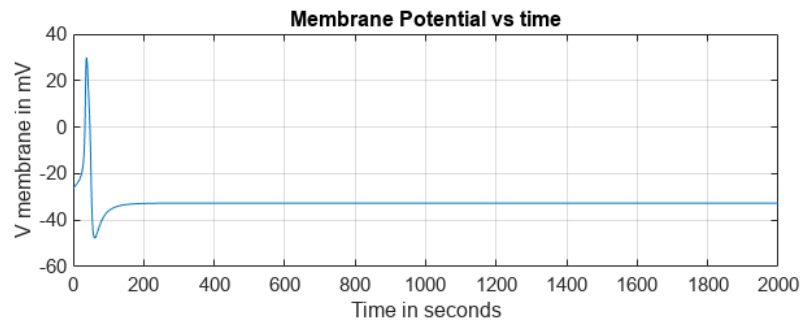
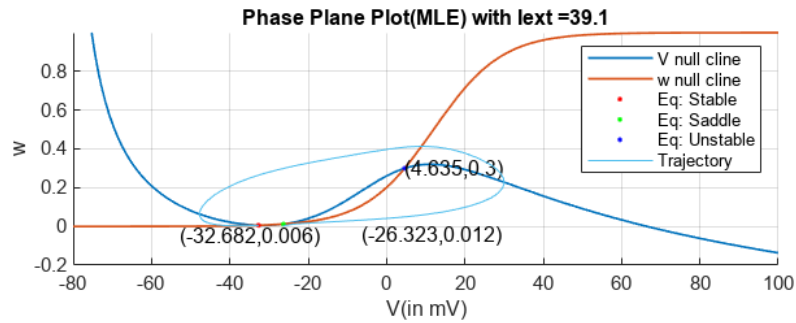
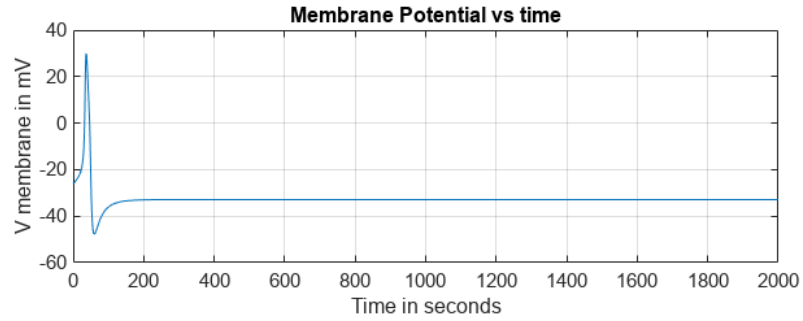
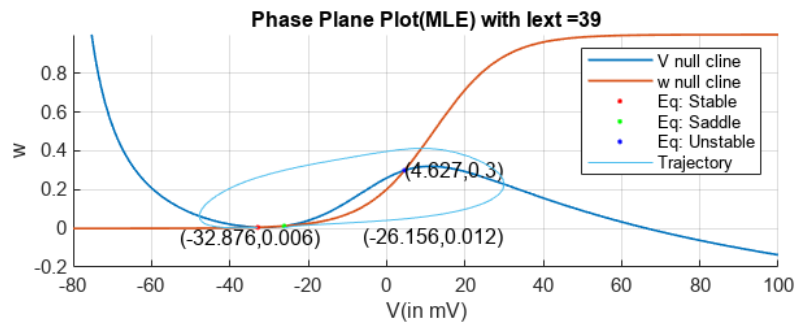
Equilibrium point 2 : The eigen values are  $0.153619+0.000000i$  ,  $-0.067328+0.000000i$

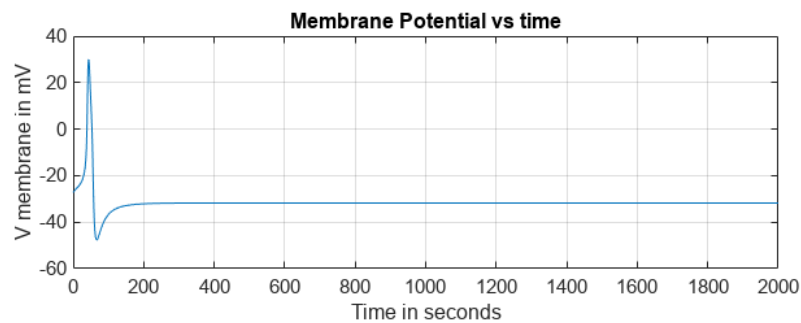
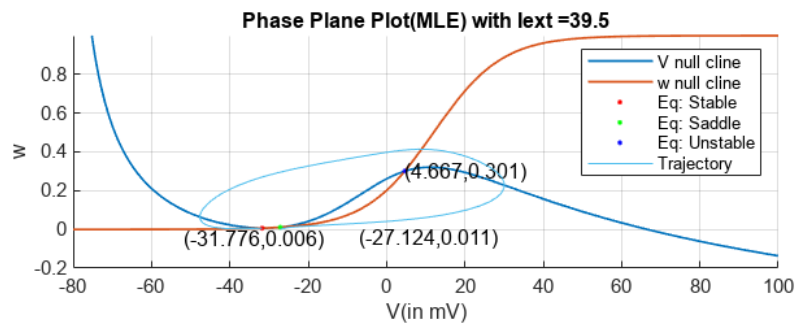
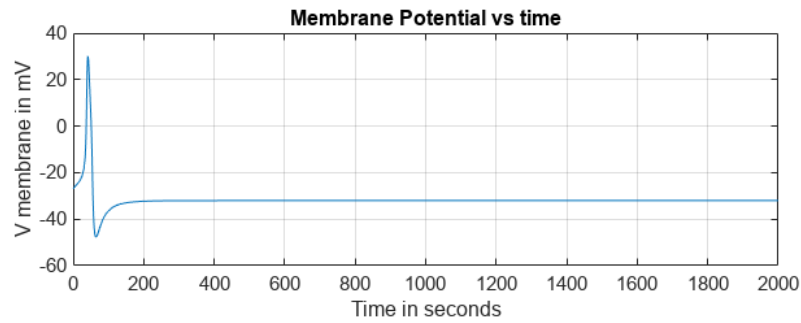
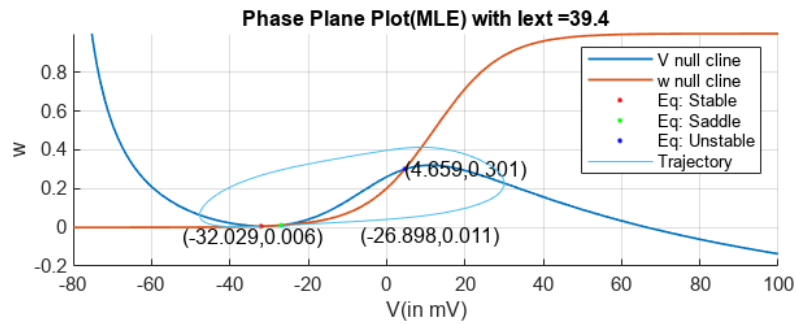
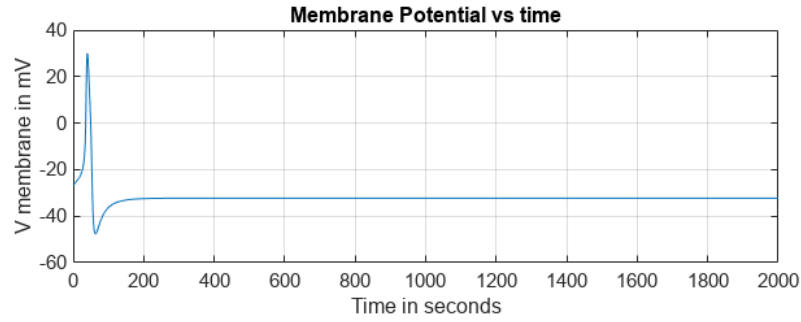
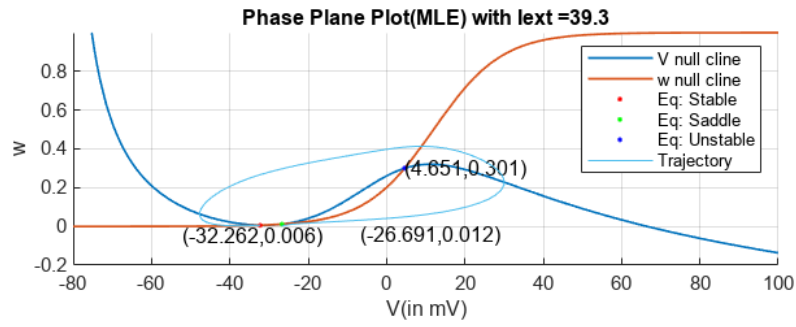
Equilibrium point 3 : The eigen values are  $0.093868+0.172310i$  ,  $0.093868-0.172310i$

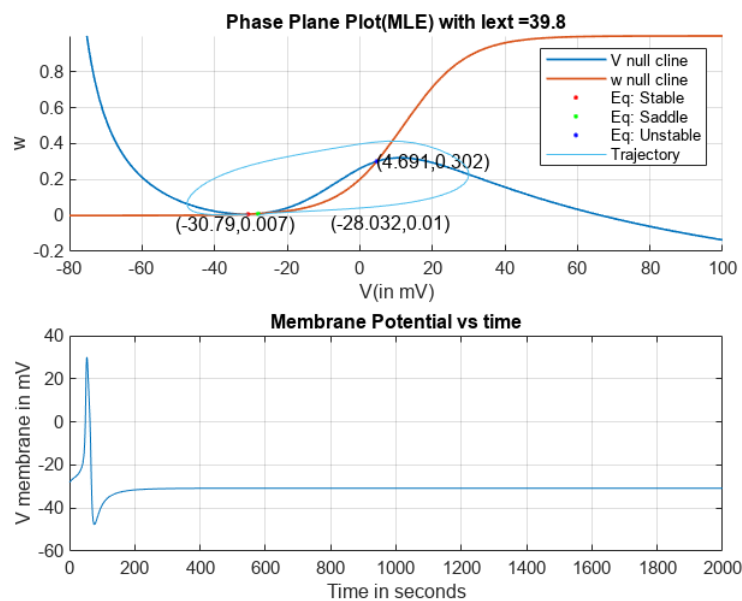
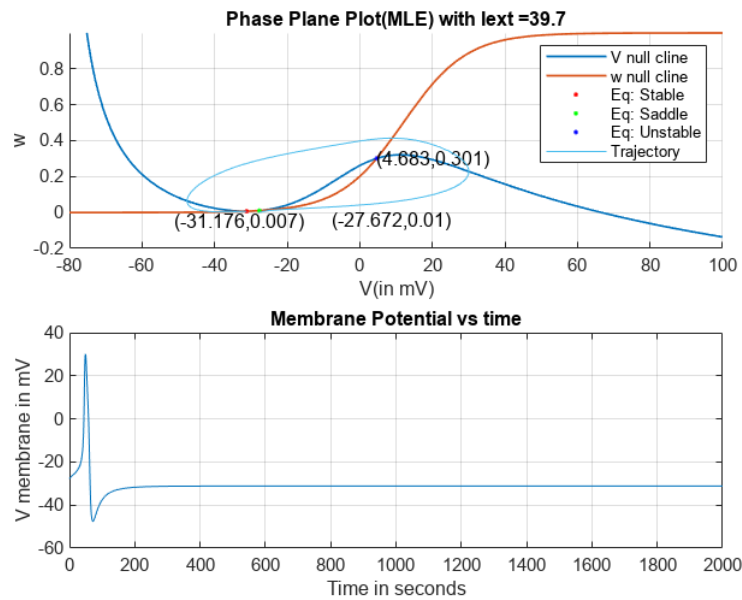
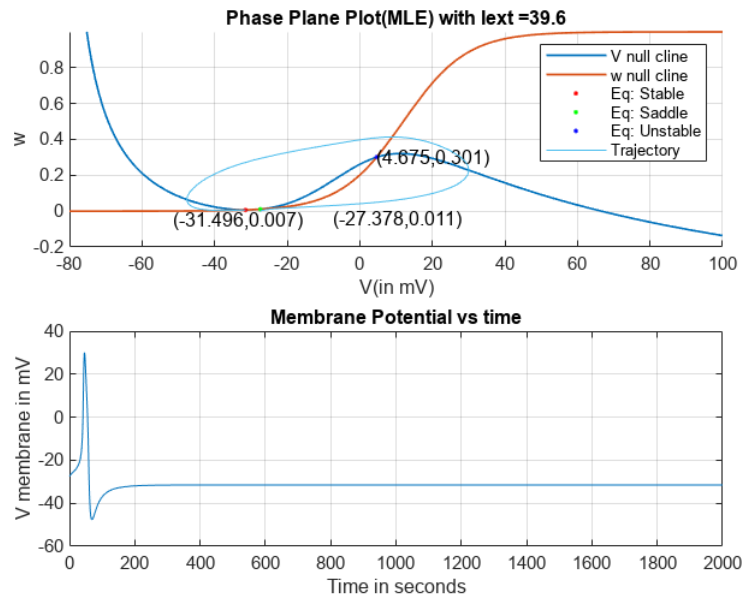


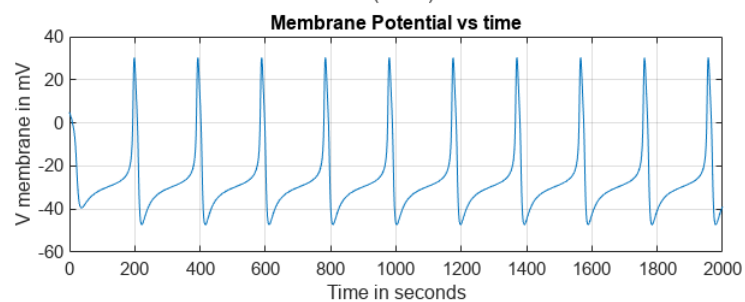
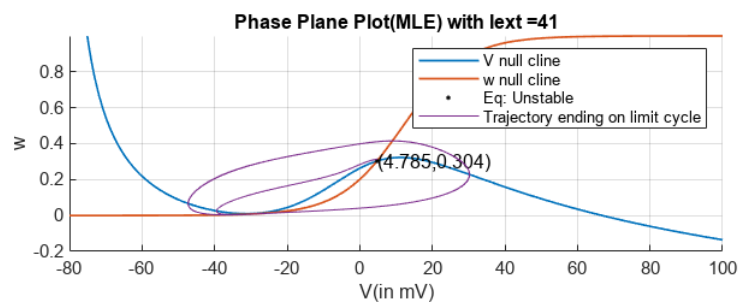
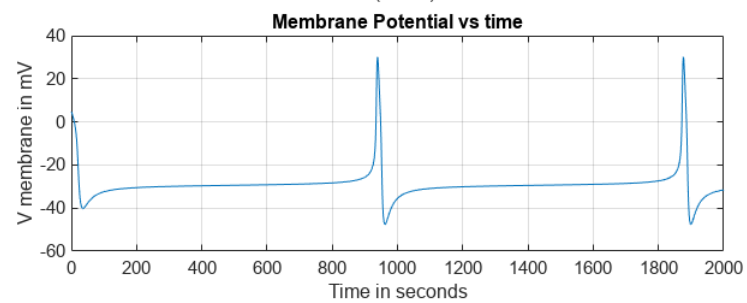
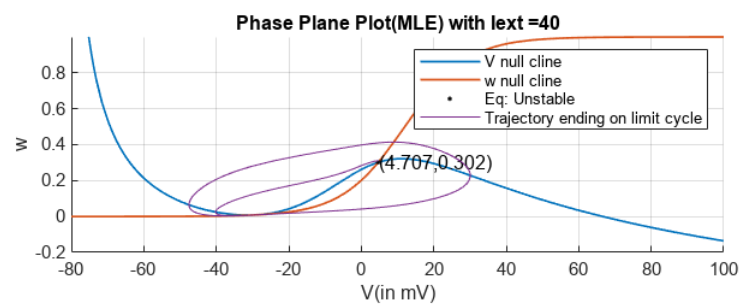
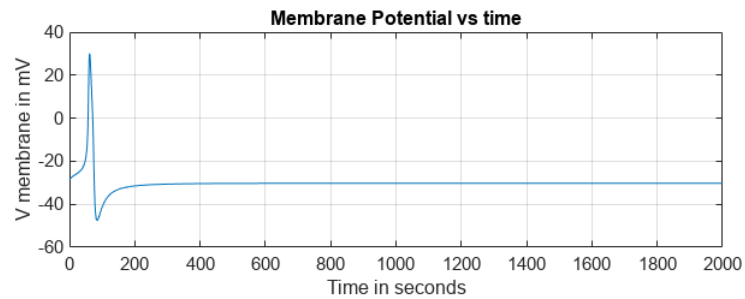
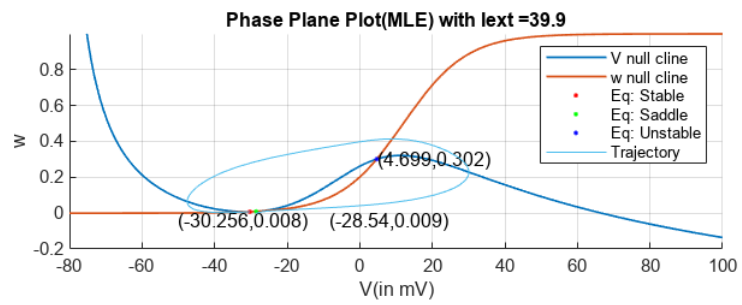
## 11. Phase plane trajectories and membrane potential waveform

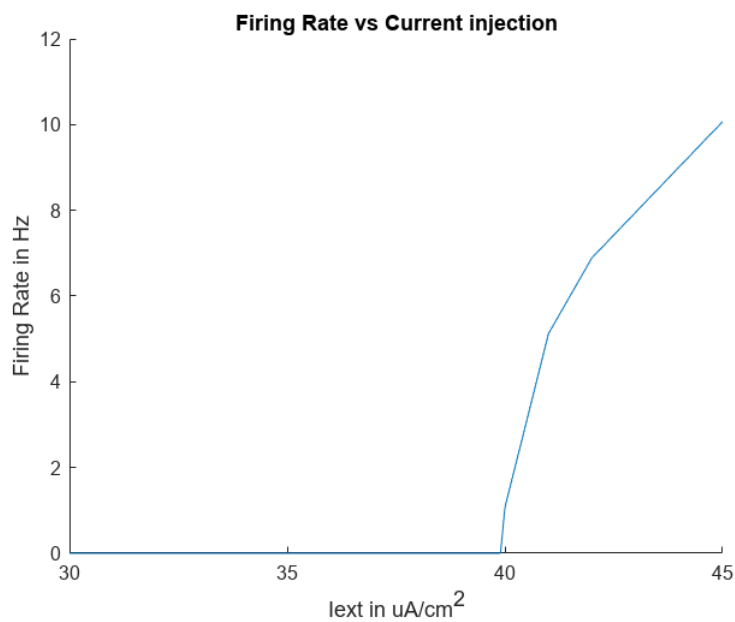
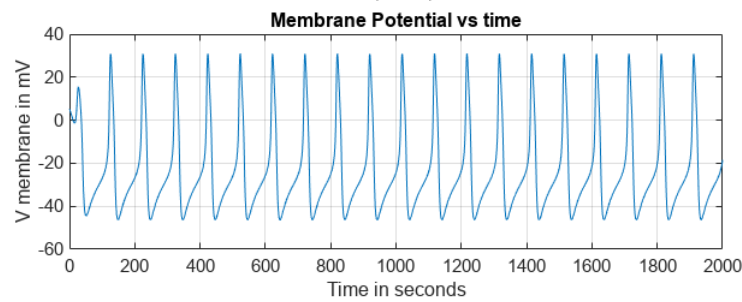
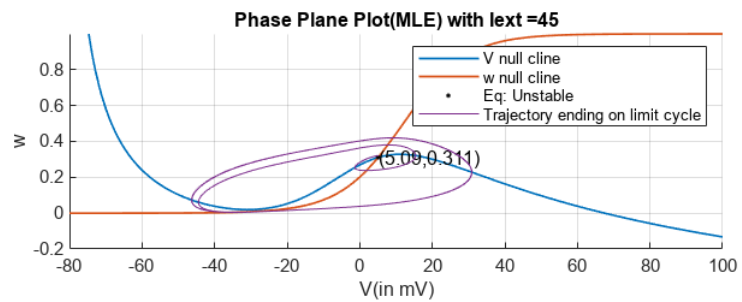
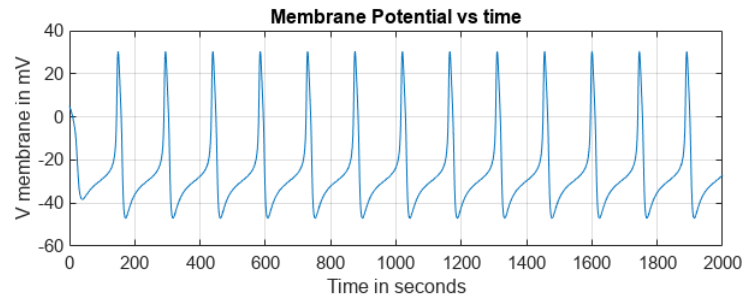
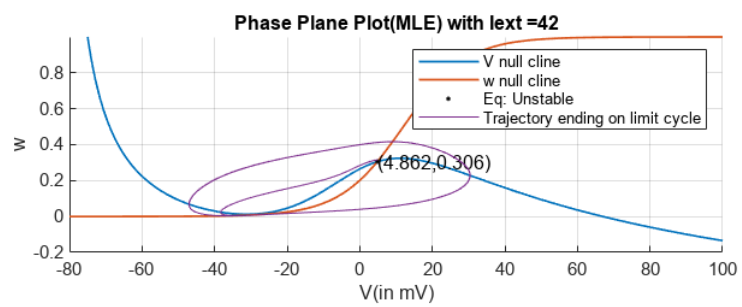












For  $I_{ext} < 40 \mu A/cm^2$  there are 3 equilibrium points. As  $I_{ext}$  increases the V null cline moves upwards and two equilibrium points (with  $V_m < 0$ ) move towards each other. After this only the unstable equilibrium point at positive membrane potential is remaining which moves further towards higher  $V_m$  as  $I_{ext}$  increases. Firing rate increases at a decreasing rate as current injection is increased beyond the threshold.

12.

Hodgkin Huxley equations

$$C \frac{dv}{dt} = I_{\text{ext}} - \bar{G}_{\text{Na}} m^3 h (v - E_{\text{Na}}) - \bar{G}_{\text{K}} m^4 (v - E_{\text{K}}) - G_{\text{L}} (v - E_{\text{L}})$$

$$\frac{dx}{dt} = \alpha_x (1-x) - \beta_x x$$

$$= \alpha_x - (\alpha_x + \beta_x) x$$

$$= \frac{\left( \frac{\alpha_x}{\alpha_x + \beta_x} \right) - x}{\frac{1}{\alpha_x + \beta_x}}$$

$$\frac{dx}{dt} = \frac{x_{\infty}(v) - x}{\tau_x(v)}$$

$$\bar{G}_{\text{K}} = 36 \text{ mS/cm}^2$$

$$\alpha_n = \frac{-0.01 (v+50)}{\exp \left[ -\frac{(v+50)}{10} \right] - 1}$$

$$E_{\text{K}} = -72 \text{ mV}$$

$$\phi = 1 \quad \beta_n = 0.125 \exp \left[ -\frac{(v+60)}{80} \right]$$

$$\bar{G}_{\text{Na}} = 120 \text{ mS/cm}^2$$

$$\alpha_m = \frac{-0.1 (v+35)}{\exp \left[ -\frac{(v+35)}{10} \right] - 1}$$

$$E_{\text{Na}} = 55 \text{ mV}$$

$$\beta_m = 4 \exp \left[ -\frac{(v+60)}{18} \right]$$

$$\alpha_h = 0.07 \exp \left[ -\frac{(v+60)}{20} \right]$$

$$\beta_h = \frac{1}{\exp \left[ -\frac{(v+30)}{10} \right] + 1}$$

$$G_{\text{L}} = 0.3 \text{ mS/cm}^2 \quad \phi = \frac{(7-6.3)}{10}, \theta = 3$$

$$E_{\text{L}} = \text{to be determined} \quad \tau_F = 6.3 \Rightarrow \phi = 1 \quad C = 1 \mu\text{F/cm}^2$$

$$V_r = -60 \text{ mV}$$

$$m = m_\alpha(V_r)$$

$$h = h_\alpha(V_r)$$

$$n = n_\alpha(V_r)$$

$$I_{\text{ext}} = 0$$

$$0 = I_{\text{ext}} - \bar{G}_{\text{Na}} m^3 h (V_r - E_{\text{Na}}) - \bar{G}_{\text{K}} n^4 (V_r - E_{\text{K}}) - G_{\text{L}} (V_r - E_{\text{L}})$$

$$\Rightarrow E_{\text{L}} = -\frac{1}{G_{\text{L}}} \left( I_{\text{ext}} - \bar{G}_{\text{Na}} m^3 h (V_r - E_{\text{Na}}) - \bar{G}_{\text{K}} n^4 (V_r - E_{\text{K}}) \right) - G_{\text{L}} V_r$$

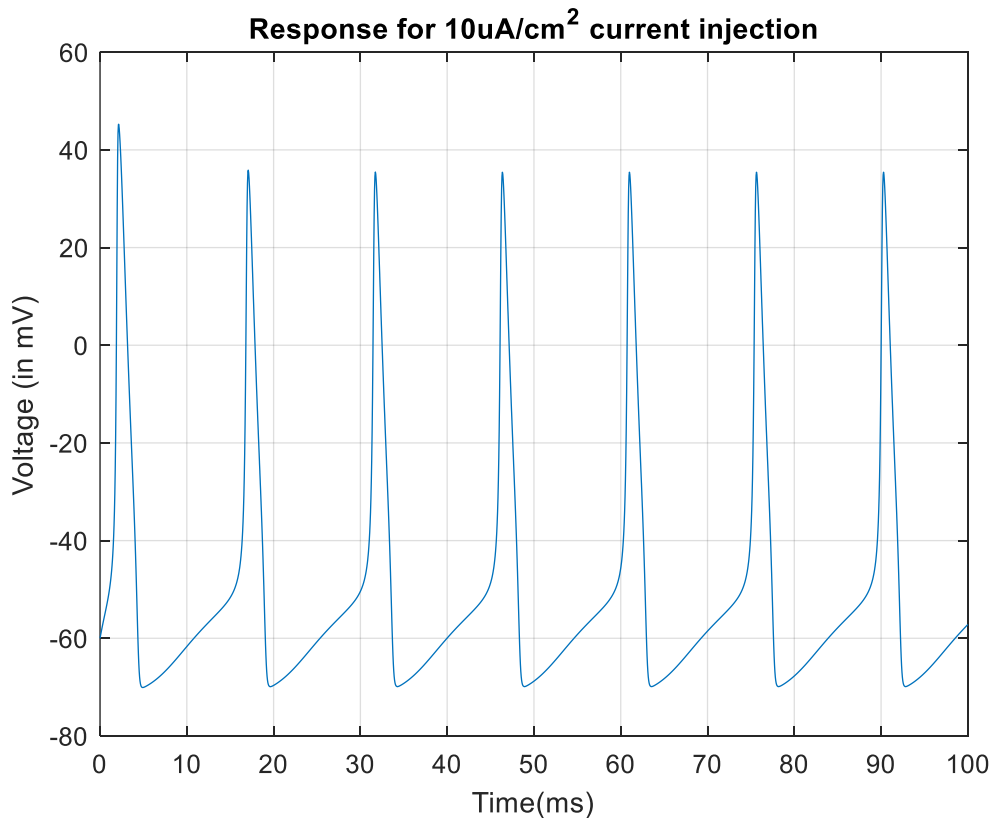
$$E_{\text{L}} = V_r - \frac{1}{G_{\text{L}}} \left( I_{\text{ext}} - \bar{G}_{\text{Na}} m^3 h (V_r - E_{\text{Na}}) - \bar{G}_{\text{K}} n^4 (V_r - E_{\text{K}}) \right)$$

To avoid  $\frac{0}{0}$  form, we add a small value  $\varepsilon = 10^{-9}$  to

the exponential terms in  $\alpha_n$  and  $\beta_n$ .

Units are consistent.

$$13. E_{\text{Leak}} = -49.40 \text{ mV}$$



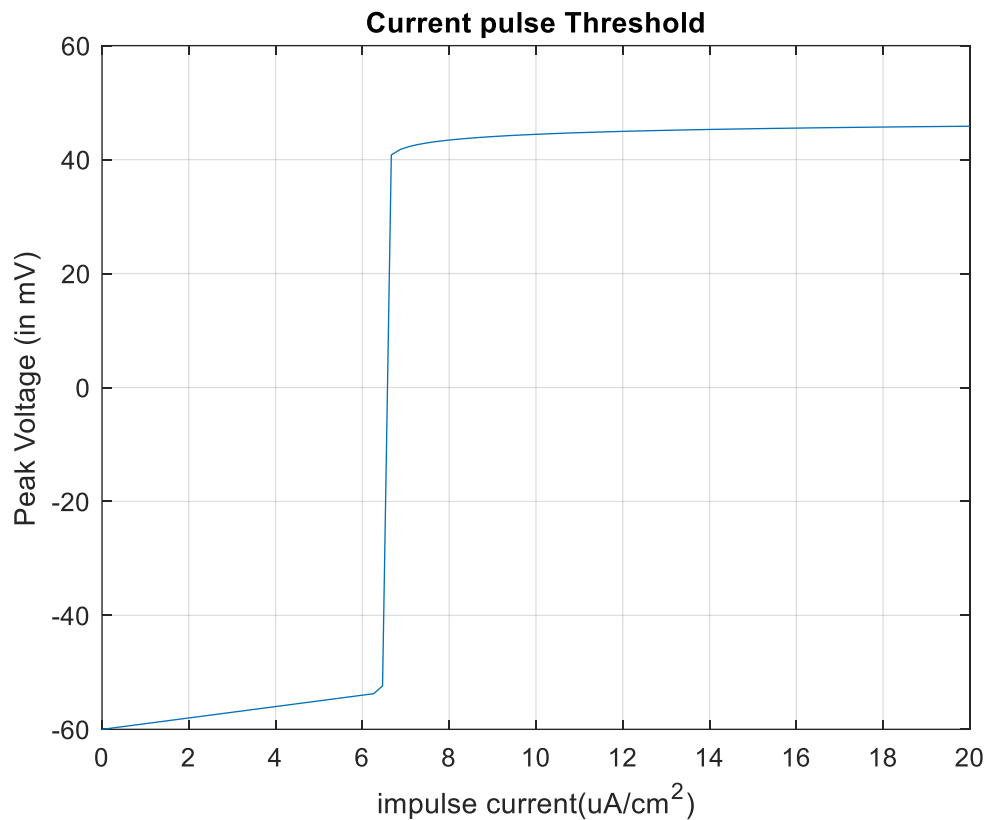
$$14. \text{Equilibrium Point : } V = -60.000000 \text{ n} = 0.317677 \text{ m} = 0.052932 \text{ h} = 0.596121$$

The eigen values are  $-4.675345 + 0.000000i$ ,  $-0.202718 + 0.383061i$ ,  $-0.202718 - 0.383061i$ ,  $-0.120659 + 0.000000i$

Stable



Threshold: 6.565657  $\mu\text{A}/\text{cm}^2$



15.

Iext = 8

Equilibrium Point 1 :  $V=-55.355128$   $n=0.390607$   $m=0.090048$   $h=0.430515$

The eigen values are  $-4.690140+0.000000i$  ,  $-0.034549+0.566792i$  ,  $-0.034549-0.566792i$  ,  $-0.135013+0.000000i$

Stable

Iext = 9

Equilibrium Point 1 :  $V=-54.952404$   $n=0.397027$   $m=0.094133$   $h=0.416502$

The eigen values are  $-4.730588+0.000000i$  ,  $-0.014865+0.578298i$  ,  $-0.014865-0.578298i$  ,  $-0.136960+0.000000i$

Stable

Iext = 10

Equilibrium Point 1 :  $V=-54.572150$   $n=0.403092$   $m=0.098131$   $h=0.403419$

The eigen values are  $-4.774093+0.000000i$  ,  $0.004122+0.588328i$  ,  $0.004122-0.588328i$  ,  $-0.138902+0.000000i$

Unstable

Iext = 11

Equilibrium Point 1 :  $V=-54.211777$   $n=0.408841$   $m=0.102052$   $h=0.391169$

The eigen values are  $-4.819956+0.000000i$  ,  $0.022390+0.597090i$  ,  $0.022390-0.597090i$  ,  $-0.140836+0.000000i$

Unstable

I<sub>ext</sub> = 12

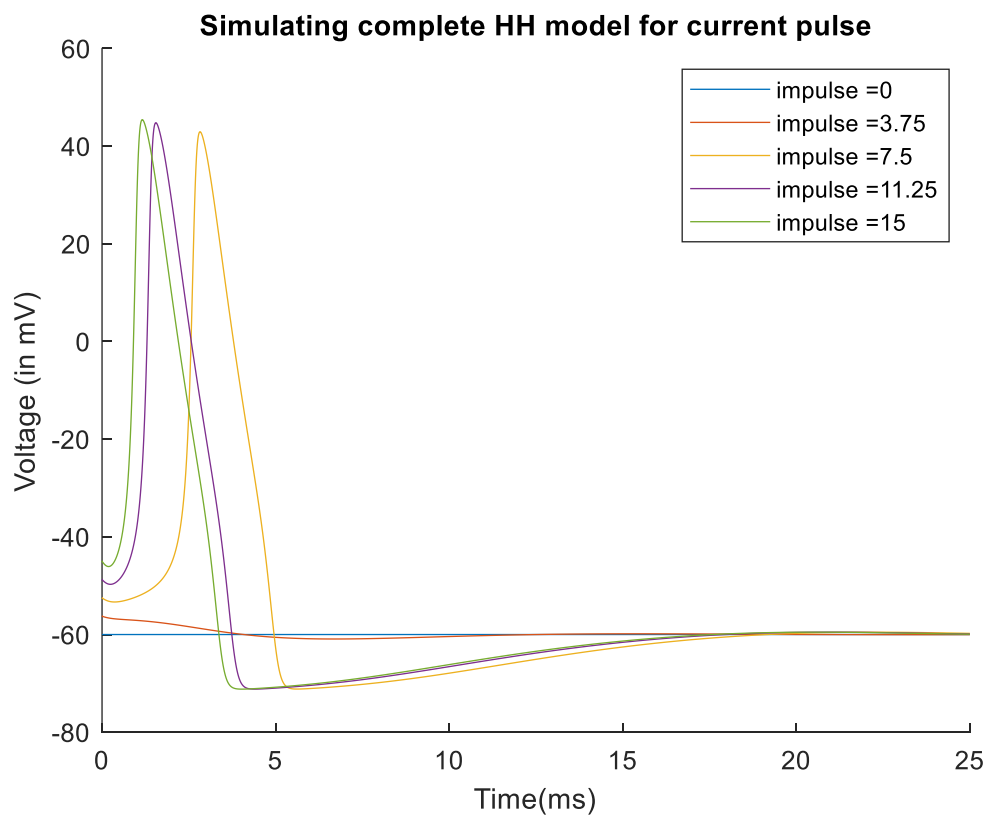
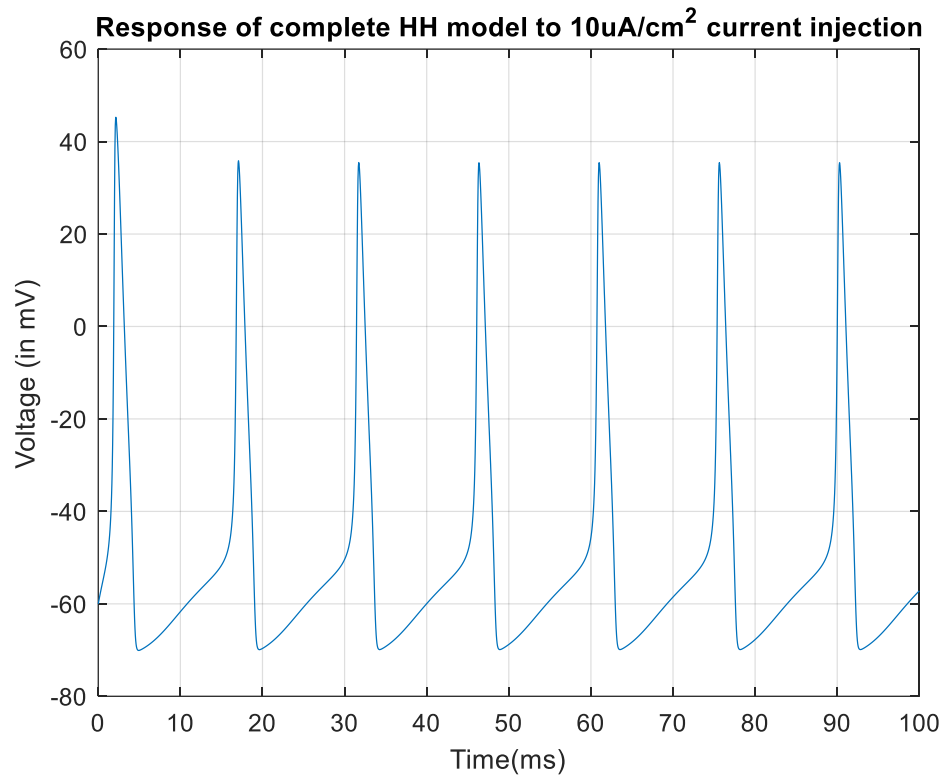
Equilibrium Point 1 :  $V=-53.869127$   $n=0.414306$   $m=0.105899$   $h=0.379667$

The eigen values are  $-4.867630+0.000000i$  ,  $0.039926+0.604761i$  ,  $0.039926-0.604761i$  ,  $-0.142760+0.000000i$

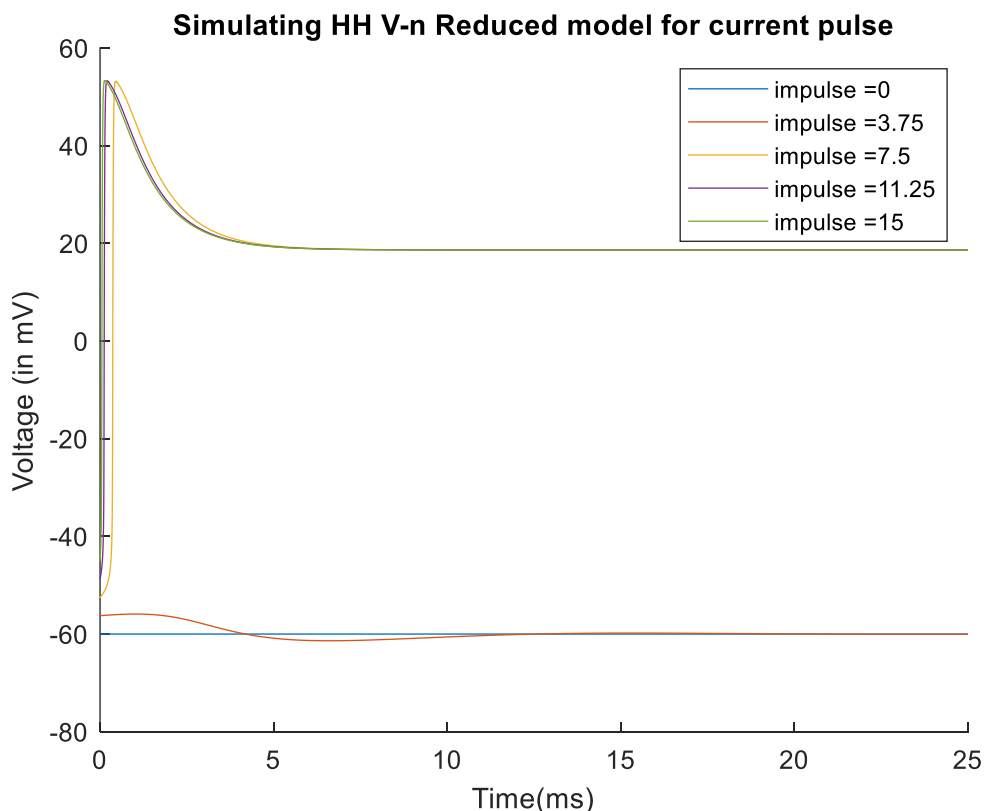
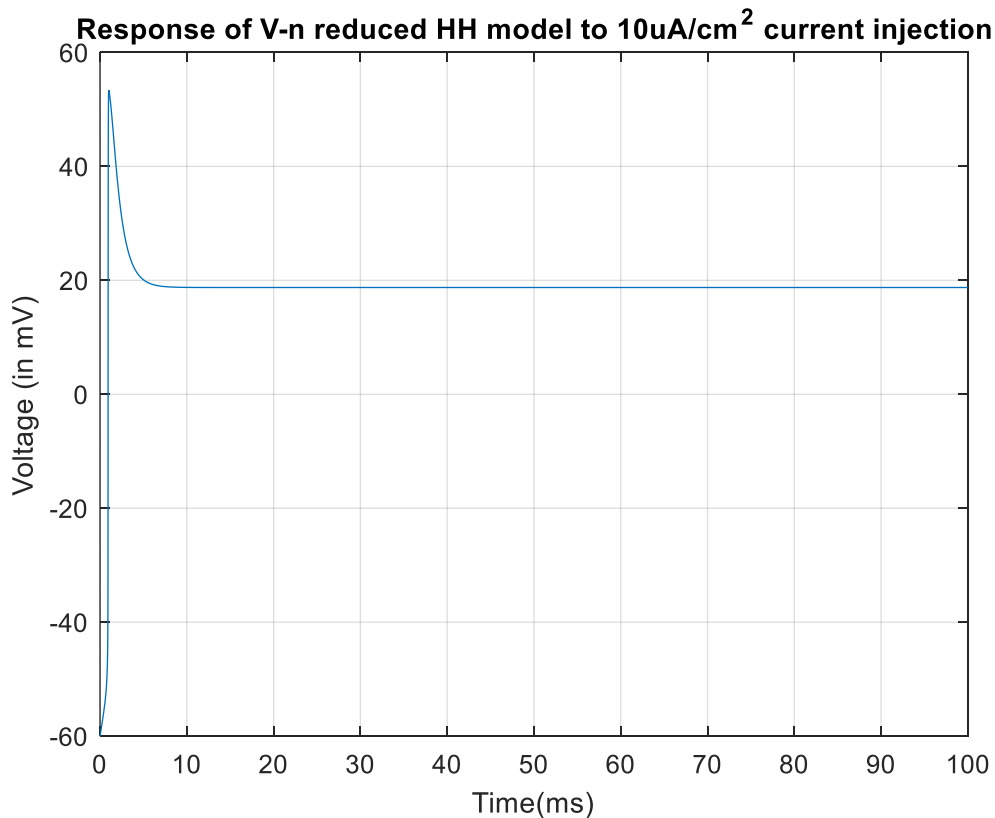
Unstable

## 16. Comparison of complete and V-n reduced Hodgkin Huxley system

Complete System:

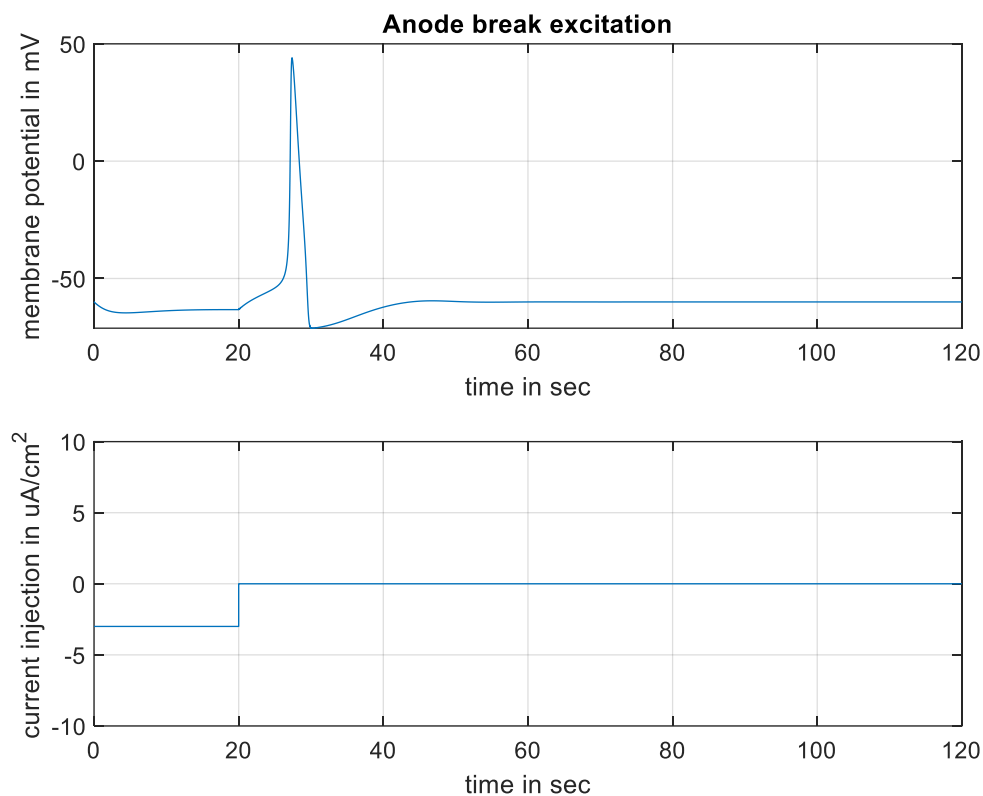


## V-n reduced HH system



The complete and the V-n reduced HH system both show the same threshold but the V-n reduced system only generates one action potential since the h gates are not allowed to close since they are fixed at  $h_{\infty}(V_r)$  ( $V_r$  is the resting membrane potential). So increase in  $V_m$  results in increase in m, which in turn increases  $V_m$ . But after reaching +20mV the h gates are still open so the potential doesn't fall. The spikes are very sharp in the reduced system because m is assumed to reach  $m_{\infty}(V)$  instantly and also the opposing effect of h gates has been removed.

## 17. Anode Break Excitation



When current injection is negative, the membrane potential decreases.  $m$ ,  $n$  are activation gates and  $h$  is an inactivation gate. So as  $V_m$  falls,  $m$  and  $n$  both decrease and  $h$  increases. When current injection is stopped,  $V_m$  quickly reaches  $V_r$  (resting membrane potential). Time constant of  $m \ll n < h$ . So  $m$  quickly reaches  $m_{\text{inf}}(V_r)$ . Since  $h$  is the slowest varying, it is at a higher value while  $n$  is low. So the inflow of  $\text{Na}^+$  ions is much higher than what it is at  $V_r$  normally.  $n$  is low so  $\text{K}^+$  ions are unable to leave the cell soma.  $\text{Na}^+$  current causes membrane potential to rise and start the positive feedback between  $V$  and  $m$  that generates an action potential. If  $m, n, h$  all were to have the same time constant, ABE would be impossible.

18.

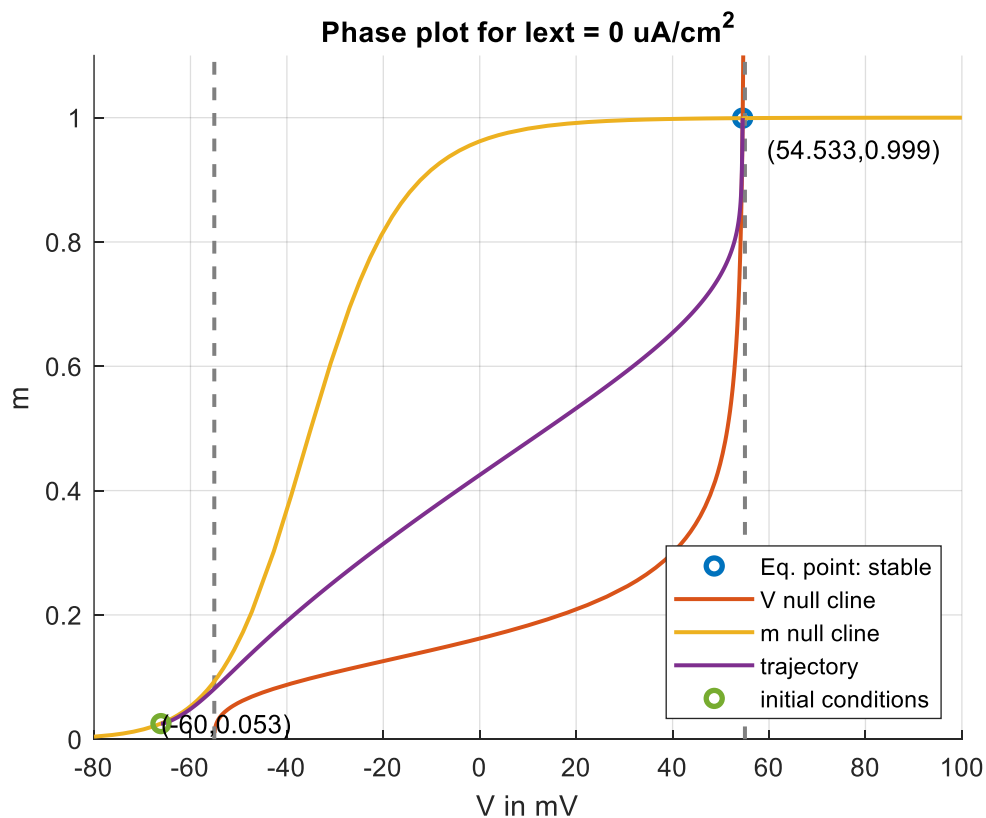
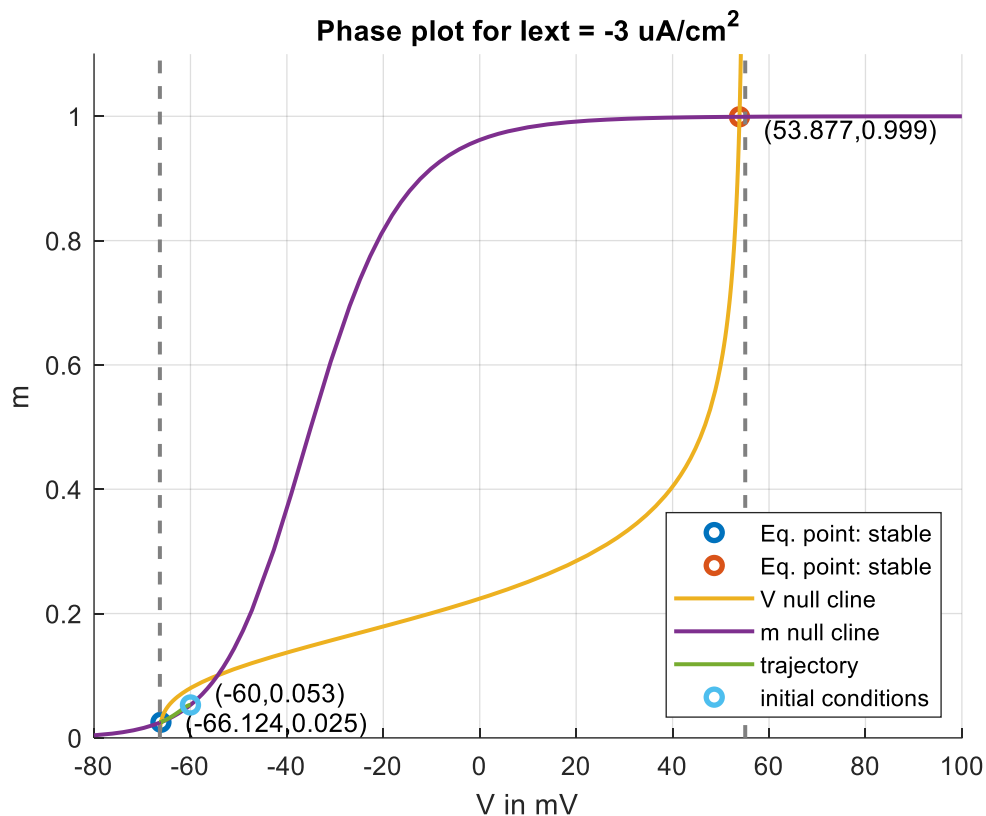
Stability analysis for  $I_{\text{ext}} = -3 \text{ uA/cm}^2$

Equilibrium point 1 : The eigen values are  $-0.610135+0.000000i$  ,  $-5.823581+0.000000i$   
 -----stable-----

Equilibrium point 2 : The eigen values are  $-72.030536+0.000000i$  ,  $-8.894267+0.000000i$   
 -----stable-----

Stability analysis for  $I_{\text{ext}} = 0 \text{ uA/cm}^2$

Equilibrium point 1 : The eigen values are  $-94.198758+0.000000i$  ,  $-8.960666+0.000000i$   
 -----stable-----



For  $I_{ext} = -3 \text{ uA/cm}^2$  there is a stable equilibrium point near the resting membrane potential. When current injection is removed i.e  $I_{ext}$  is changed to  $0 \text{ uA/cm}^2$ , in the new system there is no equilibrium point near  $V_r$ . There is still one stable equilibrium point at  $\sim +40\text{mV}$ . This is where the trajectory ends and in moving from near  $V_r$  to  $+40\text{mV}$  we observe an action potential.