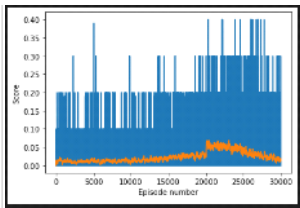
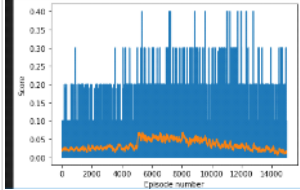


Thursday, 20 August 2020 5:45 PM

AI Page 1



15000 to 20000

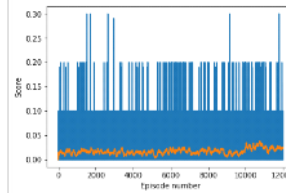


MEMORY REFRESHED

```
#Tune Hyper parameters - after 10K run
#steady learning but learning rate is slow so changing mainly Lr params. and exploit knowledge since consistent avg getting 0.2 for every 100s
setattr(colabAI, 'gamma', 0.9989)
setattr(colabAI, 'tau', 0.0013)
setattr(colabAI, 'explorfactor', 0.57)
setattr(colabAI, 'lrActor', 0.00013)
setattr(colabAI, 'lrCritic', 0.0001)
#Original : HP :Seed 1, Gamma :0.997 , TAU:0.0013, LR_Act :1.3e-07 , LR_Critic 1e-07 , Mu 0.0, Theta 0.17, Sigma 0.79, Explor
eFactor 0.9, IsTargetHardcopyTrue
```

```
setattr(colabAI, 'tau', 0.0013)
setattr(colabAI, 'explorfactor', 0.78)
setattr(colabAI, 'lrActor', 0.001)
setattr(colabAI, 'lrCritic', 0.001)
```

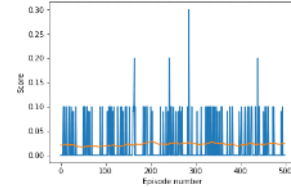
Ran for 1K



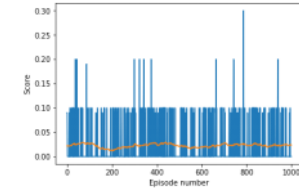
Episode: 920 Score: 0.10000000149011612 AvgScore: 0.01702181234996416  
Episode: 940 Score: 0.20000000298023224 AvgScore: 0.017043551358501965  
Episode :1000 score : 0.0 Avg Score(100+): 0.023600000366568567

Window Min 0.0 & Max 0.20000000298023224

From <https://viewlab.rezthoffi.udacity-student-workspaces.com/notebooks/Untitled%20Folder%207/Tennis.ipynb>



Above - last 500  
zoomPlot(episodes\_score, avg\_score, 1000, 11000, 12000)



```
#Tune Hyper parameters - after 10K run
#gut - steady learning but learning rate is slow so changing mainly Lr params. and exploit knowledge since consistent avg getting 0.3 a
setattr(colabAI, 'gamma', 0.978)
setattr(colabAI, 'tau', 0.0013)
setattr(colabAI, 'explorfactor', 0.78)
setattr(colabAI, 'lrActor', 0.0001)
setattr(colabAI, 'lrCritic', 0.0001)
setattr(colabAI, 'theta', 0.24)
setattr(colabAI, 'sigma', 0.89)
```

Cud see max per episode reduced to 0.2

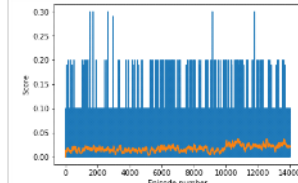
So increase Gamma

#Tune Hyper parameters - after 10K run

#Gamma gets lower - consistency max to 0.2 so increase gamma back to 0.99

#3rd change

```
setattr(colabAI, 'gamma', 0.9998)
setattr(colabAI, 'tau', 0.0013)
setattr(colabAI, 'explorfactor', 0.78)
setattr(colabAI, 'lrActor', 0.0001)
setattr(colabAI, 'lrCritic', 0.0001)
setattr(colabAI, 'theta', 0.24)
setattr(colabAI, 'sigma', 0.89)
```



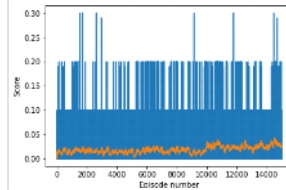
Changed - Memory experience to have np.max(rewards) instead of np.sum(rewards) -

#Tune Hyper parameters - after 10K run

#Gamma gets lower - consistency max to 0.2 so increase gamma back to 0.99

#4th time tuning back tau 0.013 and explore to 0.978

```
setattr(colabAI, 'gamma', 0.9998)
setattr(colabAI, 'tau', 0.013)
setattr(colabAI, 'explorfactor', 0.978)
setattr(colabAI, 'lrActor', 0.0001)
setattr(colabAI, 'lrCritic', 0.0001)
setattr(colabAI, 'theta', 0.24)
setattr(colabAI, 'sigma', 0.89)
```



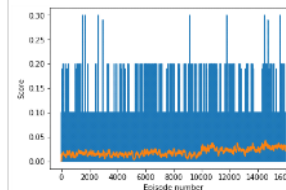
Np.max

#Tune Hyper parameters - after 10K run

#Gamma gets lower - consistency max to 0.2 so increase gamma back to 0.99

#5th time tuning on lr and explore

```
setattr(colabAI, 'gamma', 0.9998)
setattr(colabAI, 'tau', 0.013)
setattr(colabAI, 'explorfactor', 0.78)
setattr(colabAI, 'lrActor', 0.0000001)
setattr(colabAI, 'lrCritic', 0.0000013)
setattr(colabAI, 'theta', 0.24)
setattr(colabAI, 'sigma', 0.89)
```



Np.sum

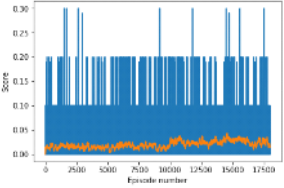
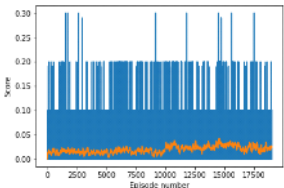
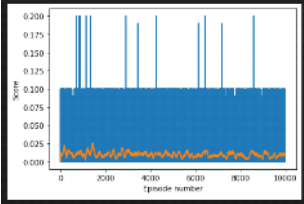
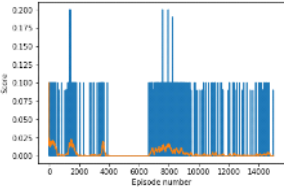
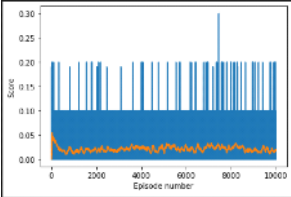
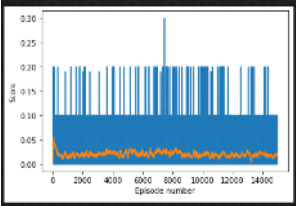
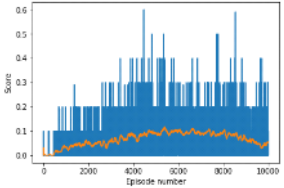
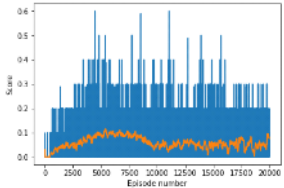
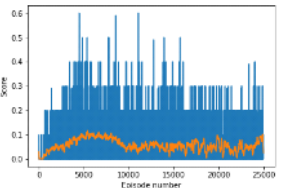
```
Reward add to memory if its greater than 0.1 instead of 0.3
#Tune Hyper parameters - after 10K run
#3rd time change
# Lr rate and explore Facotor
```

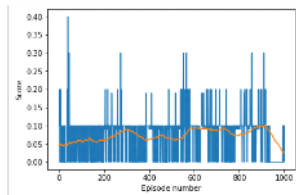
#Tune Hyper parameters - after 10K run

#Gamma gets lower - consistency max to 0.2 so increase gamma back to 0.99

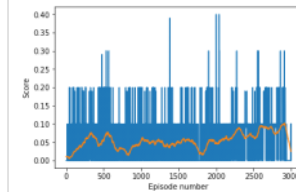
#6th time tuning on lr to too low and explore to 0.6

```
setattr(colabAI, 'gamma', 0.9998)
```

		<div><div>-Restore back since not much learning only exploring</div><div>setattr(colabAI, 'gamma', 0.99897) setattr(colabAI, 'tau', 0.0013) setattr(colabAI, 'explorfactor', 0.69) setattr(colabAI, 'lrActor', 0.0000013) setattr(colabAI, 'lrCritic', 0.0000001) setattr(colabAI, 'sigma', 0.82) setattr(colabAI, 'theta', 0.24) #Original : HP :Seed 1,Gamma :0.997 , TAU:0.0013, LR_Act :1.3e-07 , LR_Critic 1e-07 , Mu 0.0, Theta 0.17, Sigma 0.79, ExploreFactor 0.9, IsTargetHardcopyTrue</div></div>	<div><div>setattr(colabAI, 'tau', 0.013) setattr(colabAI, 'explorfactor', 0.6) setattr(colabAI, 'lrActor', 0.00000001) setattr(colabAI, 'lrCritic', 0.000000013) setattr(colabAI, 'theta', 0.24) setattr(colabAI, 'sigma', 0.89)</div><div></div></div>
			<div><div>#Back to original setting #7th time setattr(colabAI, 'gamma', 0.9998) setattr(colabAI, 'tau', 0.013) setattr(colabAI, 'explorfactor', 0.978) setattr(colabAI, 'lrActor', 0.0001) setattr(colabAI, 'lrCritic', 0.0001) setattr(colabAI, 'theta', 0.24) setattr(colabAI, 'sigma', 0.89)</div><div></div></div>
	WINDOWS	<div><div>HP :Seed 1,Gamma :0.997 , TAU:0.0013, LR_Act :1.3e-07 , LR_Critic 1e-07 , Mu 0.0, Theta 0.17, Sigma 0.79, ExploreFactor 0.9, IsTargetHardcopyTrue</div><div></div></div>	<div><div>#HP :Seed 1,Gamma :0.987999 , TAU:0.00013, LR_Act :2e-06 , LR_Critic 3e-06 , #Mu 0.0, Theta 0.77, Sigma 0.9, ExploreFactor 0.79, IsTargetHardcopyTrue showGraph(episodes_score, avg_score)</div><div></div></div>
MAX .6	Loaded the network weights From Udacity was trained	<div><div>#HP :Seed 1,Gamma :0.997999 , TAU:0.0013, LR_Act :0.00013 , LR_Critic 0.0001 , Mu 0.0, Theta 0.17, Sigma 0.9, ExploreFactor 0.79, IsTargetHardcopyFalse</div><div>Episode :100 score : 0.0 Avg Score(100+): 0.04180000068619847 Window Min 0.0 &amp; Max 0.20000000298023224</div><div></div><div>NO MAJOR IMPROVEMENT so try Memory refresh</div><div>#common Replay Memory for both Agents #Refresh Memory #Delete all old memories since mostly 0.00 or negative experience stored in last 20K #Try with current network but reduced Buffer size so very old memories will be erased #replayMemory = ReplayBuffer(action_size, BUFFER_SIZE, BATCH_SIZE, SEED) #Reduced memory size 5M to 0.2M so only recent experiences retained- old memory archived not deleted replayMemory_bkup5M = replayMemory setattr(colabAI, 'commonMemory', "memory", deque(maxlen=100000)) setattr(colabAI, 'commonMemory', "batch_size", 128)</div><div>And ran for 5K</div><div></div><div>No improvement - change HP #replayMemory_bkup5M = replayMemory setattr(colabAI, 'commonMemory', "memory", deque(maxlen=100000)) setattr(colabAI, 'commonMemory', "batch_size", 256) #Training Tennis Agents HP :Seed 1,Gamma :0.99997 , TAU:0.0017, LR_Act :0.0013 , LR_Critic 0.0013 , Mu 0.0, Theta 0.17, Sigma 0.79, ExploreFactor 0.69, IsTargetHardcopyTrue RE-RUN Hyper param tuned</div></div>	<div><div>HP :Seed 1, SEEDC05 Gamma :0.997999 , TAU:0.0013 , LR_Act :0.0002 , LR_Critic 0.0003 , Mu 0.0, Theta 0.77, Sigma 0.9, ExploreFactor 0.79, IsTargetHardcopyTrue</div><div>Episode :4470 Score: 0.6000000089406967 AvgScore: 0.04740715956827946 Episode: 4490 Score: 0.10000000149011612 AvgScore: 0.04768151521334271 Episode :4500 score : 0.0 Avg Score(100+): 0.093300000141635537 Window Min 0.0 &amp; Max 0.6000000089406967</div><div>FIRST TIME Avg Score +0.1 pisode :6000 score : 0.100000000149011612 Avg Score(100+): 0.103900000162646175 Window Min 0.0 &amp; Max 0.300000000447034836 Episode :6600 score : 0.100000000149011612 Avg Score(100+): 0.104900000167861581 Window Min 0.0 &amp; Max 0.300000000447034836 Episode :6900 score : 0.100000000149011612 Avg Score(100+): 0.095800000150948763 Window Min 0.0 &amp; Max 0.40000000059604645 Episode :7800 score : 0.200000000298023224 Avg Score(100+): 0.086400000130981207 Window Min 0.0 &amp; Max 0.300000000447034836 Episode :8600 score : 0.0 Avg Score(100+): 0.08840000013396144 Window Min 0.0 &amp; Max 0.300000000447034836</div><div></div><div>Continues 10K</div><div></div><div>#Runtime config #1st change after 20K - 21 start #just explore factor reduced &amp; theta 0.001 setattr(colabAI, 'gamma', 0.997999) setattr(colabAI, 'tau', 0.0013) setattr(colabAI, 'explorfactor', 0.69)#reduced setattr(colabAI, 'lrActor', 0.0002) setattr(colabAI, 'lrCritic', 0.0003) setattr(colabAI, 'sigma', 0.9) setattr(colabAI, 'theta', 0.76)#reduced</div><div></div><div>ZOOM 24k to 25k</div></div>



zoomPlot(episodes\_score, avg\_score, 3000, 22000, 25000)



Same kind of learning or little down

Why cant refresh the moemry

- Old memories with more negative rcords may recall-
- If we empty past memories and with new learning will get add more positive rewards greater than 0. or 0.2

SO, Changed to see the effects

#common Replay Memory for both Agents

#Refresh Memory

#Delete all old memories since mostly 0.00 or negative experience stored in last 20K

#Try with current network but reduced Buffer size so very old memories will be erased

#replayMemory = ReplayBuffer(action\_size, BUFFER\_SIZE, BATCH\_SIZE, SEED)

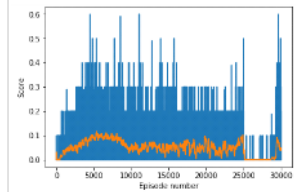
#Reduced memory size 5M to 0.2M so only recent experiences retained- old memory archived not deleted

replayMemory\_bkup5M = replayMemory

setattr(colabAI.commonMemory, "memory", deque(maxlen=200000))

setattr(colabAI.commonMemory, "batch\_size", 256)

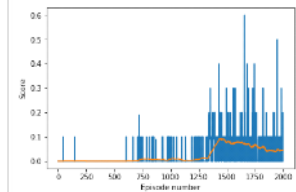
#MEMORY



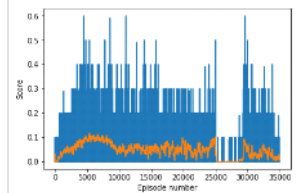
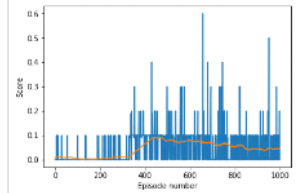
#ZOOM Last 2000

#after memory refreshed

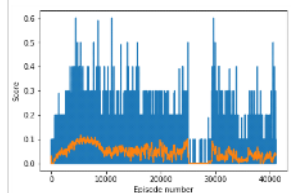
zoomPlot(episodes\_score, avg\_score, 2000, 28000, 30000)



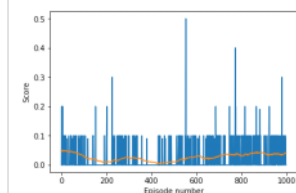
Last 1000 below

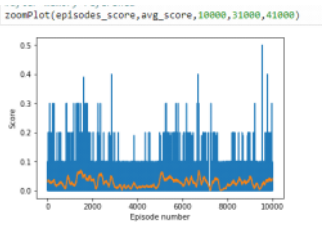
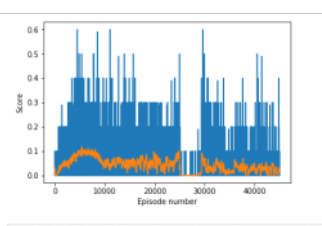
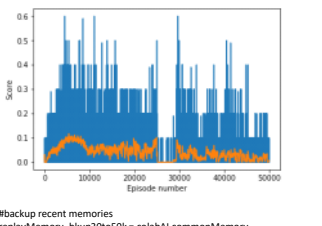
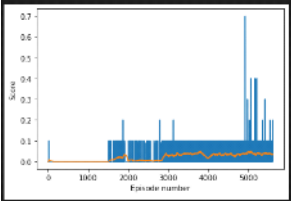


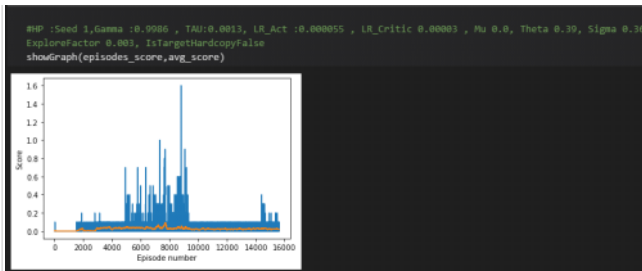
IMPROVEMENT



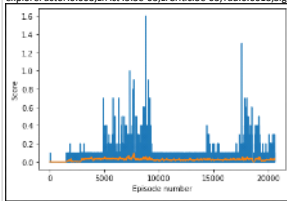
zoomPlot(episodes\_score, avg\_score, 1000, 40000, 41000)



			 <pre>zoomPlot(episodes_score,avg_score,10000,31000,41000)</pre>
			 <pre>: print('Length of Episodes {} and Max Score so far:{}'.format(len(episodes_score),np.max(episodes_score))) Length of Episodes 45000 and Max Score so far:0.60000000000000009406067</pre>
			<pre>#just gamma reduced from .997999 to .987999 setattr(colabAI,'gamma',0.987999)#reduced setattr(colabAI,'tau',0.0013) setattr(colabAI,'explorfactor',0.89) setattr(colabAI,'lrActor',0.00021)#0.01 setattr(colabAI,'lrCritic',0.00031)#0.01 setattr(colabAI,'sigma',0.9) setattr(colabAI,'theta',0.79)  #Training Tennis Agents ##HP-Seed 1,Gamma-0.987999, TAU-0.0013, LR_Act-0.00021, LR_Critic-0.00031, ##Mu-0.0, Theta-0.77, Sigma-0.9, ExploreFactor-0.79, IsTargetHardcopy=True  #45K completed w- Continue for next 5k Length of Episodes 50000 and Max Score so far:0.60000000000000009406067</pre>  <pre>#backup recent memories replayMemory_bkup30to50k = colabAI.commonMemory #reset the memory size setattr(colabAI.commonMemory,"memory",deque(maxlen=5000000)) #restore old memories setattr(colabAI,"commonMemory",replayMemory_bkup5M) setattr(colabAI.commonMemory,"batch_size",256)</pre>
		<pre>WINDOWS {   "SEEDC": 2,   "SEED": 1,   "BUFFER_SIZE": 1000000,   "BATCH_SIZE": 256,   "GAMMA": 0.9987999,   "TAU": 0.0013,   "LR_CRITIC": 0.00019,   "LR_ACTOR": 0.00019,   "MU": 0,   "THETA": 0.26,   "SIGMA": 0.36,   "EXPLORE": 0.03 }  "SEEDC": 2, "SEED": 1, "BUFFER_SIZE": 1000000, "BATCH_SIZE": 256, "GAMMA": 0.9987999, "TAU": 0.0013, "LR_CRITIC": 0.00019, "LR_ACTOR": 0.00019, "MU": 0, "THETA": 0.26, "SIGMA": 0.36, "EXPLORE": 0.03  #Load trained model weights where got 0.5 in 1800 episodes itself actornnk_path = "./Maxpoint9/checkpoint_actor_point_base-copy4.pth" criticnn_path = "./Maxpoint9/checkpoint_critic_point_base-copy4.pth" act_tar_path = "./Maxpoint9/checkpoint_actor_target_base-copy4.pth" critc_tar_path = "./Maxpoint9/checkpoint_critic_target_base-copy4.pth" colabAI.load_trained_model(actornnk_path,criticnn_path,act_tar_path,critc_tar_path)  #tune 2 after 5k episodes for agent in colabAI.multiagent:   setattr(agent,"gamma",0.9986)   setattr(agent,"explorfactor",0.893)   setattr(agent,"lrActor",0.00055)   setattr(agent,"lrCritic",0.00083)   setattr(agent,"tau",0.0013)   setattr(agent,"sigma",0.369)   setattr(agent,"theta",0.39)  Episode: 4310 Score: 0.10000000149011612 AvgScore (100+): 0.02990000044927001 CurrentWindowMax: 0.10000000149011612 Episode: 4320 Score: 0.0 AvgScore (100+): 0.03820000059902668 CurrentWindowMax: 0.700000104308128</pre>  <pre>Episode: 720 Score: 0.0 AvgScore (100+): 0.02990000044927001 CurrentWindowMax: 0.30000000447034836 Episode: 730 Score: 0.7000000104308128 AvgScore (100+): 0.0379000005684793 CurrentWindowMax: 0.7000000104308128 Episode: 740 Score: 0.0 AvgScore (100+): 0.041900000628083946 CurrentWindowMax: 0.7000000104308128</pre>	



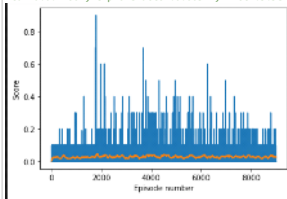
Gamma:0.9986 , exploreFactor:0.003,LRAct :5.5e-05,LR\_Critic:3e-05,Tau:0.0013,Sigma:0.369,Theta:0.39 Gamma:0.9986 ,  
exploreFactor:0.003,LRAct :5.5e-05,LR\_Critic:3e-05,Tau:0.0013,Sigma:0.369,Theta:0.39



[1] Learning triggered at every step only when the reward is greater than 0.19 .  
After 20k episodes when getting consistent 0.3 to 0.7 to 1.0  
Changed the learning every step to see the effect -11.45 am 29th aug

```
[2]
if(np.max(agent_scores)>=0.39):
#changed from 0.19 to 0.39 after 15k episodeses -got max 1.7
replayHighMemoryRewards.add((states,actions,rewards,next_states,dones))
```

[3]  
#Gamma:0.9986 , exploreFactor:0.00329,LRAct :5.5e-06,LR\_Critic:3e-06,Tau:0.0013,Sigma:0.169,Theta:0.039



Gamma:0.99896 , exploreFactor:0.00327,LRAct :7.5e-08,LR\_Critic:2e-07,Tau:0.00013,Sigma:0.279,Theta:0.19

```
#Load trained model weights where got 0.5 in 1800 episodes itself
actornnk_path = "./Max1_7/checkpoint_actor_point_base1p7.pth"
criticnn_path = "./Max1_7/checkpoint_critic_point_base1p7.pth"
act_tar_path = "./Max1_7/checkpoint_actor_target_base1p7.pth"
critc_tar_path = "./Max1_7/checkpoint_critic_target_base1p7.pth"
colabAI.load_trained_model(actornnk_path,criticnn_path,act_tar_path,critc_tar_path)
```

5K - Learn only when reward >0.19

Then 6k to 10 - every step

Episode: 660 Score: 0.0 AvgScore (100+): 0.027800000421702862 CurrentWindowMax: 0.6000000089406967  
Episode: 670 Score: 0.10000000149011612 AvgScore (100+): 0.040800000615417956 CurrentWindowMax: 1.0000000149011612

Episode: 860 Score: 0.0 AvgScore (100+): 0.027000000402331352 CurrentWindowMax: 0.4000000059604645 Episode: 870 Score: 0.0 AvgScore (100+):  
0.049000000730156895 CurrentWindowMax: 1.8000000268220901

```
Episode :800 score : 0.0 Avg Score (100+): 0.03690000055357814 WinMax 0.4000000059604645
Episode: 810 Score: 0.0 AvgScore (100+): 0.03390000050887466 CurrentWindowMax: 0.4000000059604645
Episode: 820 Score: 0.0 AvgScore (100+): 0.03290000049397349 CurrentWindowMax: 0.4000000059604645
Episode: 830 Score: 0.0 AvgScore (100+): 0.027900000419467687 CurrentWindowMax: 0.4000000059604645
Episode: 840 Score: 0.0 AvgScore (100+): 0.029000000432133674 CurrentWindowMax: 0.4000000059604645
Episode: 850 Score: 0.0 AvgScore (100+): 0.030000000447034835 CurrentWindowMax: 0.4000000059604645
Episode: 860 Score: 0.0 AvgScore (100+): 0.027000000402331352 CurrentWindowMax: 0.4000000059604645
Episode: 870 Score: 0.0 AvgScore (100+): 0.049000000730156895 CurrentWindowMax: 1.8000000268220901

> ML
#Gamma:0.99896 , exploreFactor:0.00327,LRAct :7.5e-08,LR_Critic:2e-07,Tau:0.00013,Sigma:0.279,Theta:0.19
showGraph(episodes_score,avg_score)
```

```
Episode :800 score : 0.0 Avg Score (100+): 0.03690000055357814 WinMax 0.4000000059604645
Episode: 810 Score: 0.0 AvgScore (100+): 0.03390000050887466 CurrentWindowMax: 0.4000000059604645
Episode: 820 Score: 0.0 AvgScore (100+): 0.03290000049397349 CurrentWindowMax: 0.4000000059604645
Episode: 830 Score: 0.0 AvgScore (100+): 0.027900000419467687 CurrentWindowMax: 0.4000000059604645
Episode: 840 Score: 0.0 AvgScore (100+): 0.029000000432133674 CurrentWindowMax: 0.4000000059604645
Episode: 850 Score: 0.0 AvgScore (100+): 0.030000000447034835 CurrentWindowMax: 0.4000000059604645
Episode: 860 Score: 0.0 AvgScore (100+): 0.027000000402331352 CurrentWindowMax: 0.4000000059604645
Episode: 870 Score: 0.0 AvgScore (100+): 0.049000000730156895 CurrentWindowMax: 1.8000000268220901
Episode: 880 Score: 0.10000000149011612 AvgScore (100+): 0.04500000067055225 CurrentWindowMax: 1.8000000268220901

> ML
#Gamma:0.99896 , exploreFactor:0.00327,LRAct :7.5e-08,LR_Critic:2e-07,Tau:0.00013,Sigma:0.279,Theta:0.19
showGraph(episodes_score,avg_score)
```

Episode: 2170 Score: 0.10000000149011612 AvgScore (100+): 0.04000000059604645 CurrentWindowMax: 0.6000000089406967  
Episode: 2180 Score: 0.0 AvgScore (100+): 0.04100000061094761 CurrentWindowMax: 0.6000000089406967  
Episode: 2190 Score: 0.0 AvgScore (100+): 0.04100000061094761 CurrentWindowMax: 0.6000000089406967  
Episode: 2200 Score: 0.4000000059604645 AvgScore (100+): 0.04700000070035457 CurrentWindowMax: 0.6000000089406967  
Episode :2200 score : 0.4000000059604645 Avg Score(100+): 0.04700000070035457 WinMax 0.6000000089406967  
Episode: 2210 Score: 0.0 AvgScore (100+): 0.04300000064074993 CurrentWindowMax: 0.6000000089406967

```

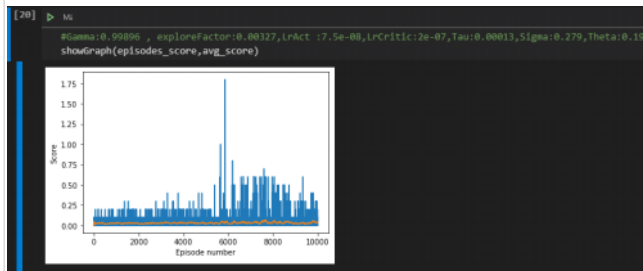
Episode: 2590 Score: 0.0 AvgScore (100+): 0.04500000007855225 CurrentWindowMax: 0.50000000/4505806
Episode: 2600 Score: 0.0 AvgScore (100+): 0.046000000068543415 CurrentWindowMax: 0.70000000104308128
Episode: 2600 score : 0.0 Avg Score(100+): 0.046000000068543415 WinMax 0.70000000104308128
Episode: 2610 Score: 0.0 AvgScore (100+): 0.06000000009406967 CurrentWindowMax: 0.70000000104308128
Episode: 2620 Score: 0.0 AvgScore (100+): 0.059000000087916851 CurrentWindowMax: 0.70000000104308128
Episode: 2630 Score: 0.10000000149011612 AvgScore (100+): 0.06000000009406967 CurrentWindowMax: 0.70000000104308128
Episode: 2640 Score: 0.0 AvgScore (100+): 0.058000000086426735 CurrentWindowMax: 0.70000000104308128
Episode: 2650 Score: 0.0 AvgScore (100+): 0.06000000009406967 CurrentWindowMax: 0.70000000104308128
Episode: 2660 Score: 0.0 AvgScore (100+): 0.06000000009406967 CurrentWindowMax: 0.70000000104308128
Episode: 2670 Score: 0.0 AvgScore (100+): 0.059000000087916851 CurrentWindowMax: 0.70000000104308128
Episode: 2680 Score: 0.6000000009406967 AvgScore (100+): 0.06300000093877316 CurrentWindowMax: 0.70000000104308128

```

```

Episode: 2970 Score: 0.0 AvgScore (100+): 0.02600000038743019 CurrentWindowMax: 0.4000000059604645
Episode: 2980 Score: 0.0 AvgScore (100+): 0.035000000052154064 CurrentWindowMax: 0.60000000089406967
Episode: 2990 Score: 0.5000000074585806 AvgScore (100+): 0.04400000005565109 CurrentWindowMax: 0.60000000089406967
Episode: 3000 Score: 0.0 AvgScore (100+): 0.05000000074585806 CurrentWindowMax: 0.60000000089406967
Episode: 3000 score : 0.0 Avg Score(100+): 0.05000000074585806 WinMax 0.60000000089406967
Episode: 3010 Score: 0.0 AvgScore (100+): 0.051000000759950224 CurrentWindowMax: 0.60000000089406967

```



Refreshed memory length 4640

Re-run for next 5000