Baseline Network

10 epoch후, training accuracy = 0.8538과 validation accuracy = 0.7017 Testing accuracy = 0.6996

tester

Summary

<u>Aa</u> Model	# Attack Success	
<u>FGSM</u>	0.1348	e = 0.01
Basic Iterative FGSM	0.1482	e= 0.01, a = 0.1, iteration = 5
Least-Likely Iterative FGSM	0.0228	e=0.01, 0.1, iteration =5
Untitled		

FGSM Method

attack success for different epsilon

<u>Aa</u> Epsilon Value	≡ Accuracy
<u>0.01</u>	0.1348
<u>0.05</u>	0.1629
0.10	0.1775
0.15	0.1899
0.20	0.2074

Sample images of successful attacks

 ϵ = 0.01



epsilon = 0.01 Misclassified as: cat





epsilon = 0.01 Misclassified as: cat



epsilon = 0.01 True Label: dog



epsilon = 0.01 Misclassified as: airplane



epsilon = 0.01 True Label: deer



epsilon = 0.05 Misclassified as: automobile



epsilon = 0.05[True Label: airplane



epsilon = 0.05 Misclassified as: cat



epsilon = 0.05[True Label: bird



epsilon = 0.05 Misclassified as: deer



epsilon = 0.05[True Label: bird



epsilon = 0.1 Misclassified as: airplane



epsilon = 0.1 True Label: automobile



epsilon = 0.1 Misclassified as: automobile



epsilon = 0.1 True Label: airplane



epsilon = 0.1 Misclassified as: automobile



epsilon = 0.1 True Label: airplane







epsilon = 0.15 Misclassified as: dog



epsilon = 0.15
True Label: cat



epsilon = 0.15 Misclassified as: frog



epsilon = 0.15[True Label: cat



epsilon = 0.2 Misclassified as: frog



epsilon = 0.2[True Label: ship



epsilon = 0.2[Misclassified as: cat



epsilon = 0.2 True Label: airplane



epsilon = 0.2 Misclassified as: frog



epsilon = 0.2 True Label: cat

Iterative FGSM Method

attack success for different epsilon (alpha = 0.1, iteration = 5)

<u>Aa</u> Epsilon value	≡ Alpha	Iteration	# Accuracy
<u>0.01</u>	0.1	5	0.1482
0.01	0.1	10	0.1482
0.01	0.5	5	0.1482
0.05	0.1	5	0.1938
0.05	0.1	10	0.1937
0.05	0.5	5	0.1904
0.1	0.1	5	0.2641

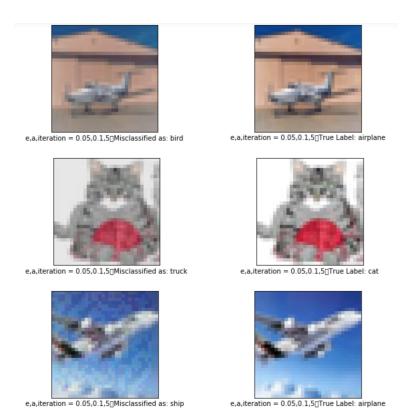
<u>Aa</u> Epsilon value	≡ Alpha	■ Iteration	# Accuracy
0.1	0.1	10	0.2746
<u>0.1</u>	0.5	5	0.251
0.2	0.1	5	0.4001
0.2	0.1	10	0.4403
<u>Untitled</u>			

Sample images of successful attacks

 ϵ = 0.01, α = 0.1, iteration = 5



 ϵ = 0.05, α = 0.1, iteration = 5



 ϵ = 0.1, α = 0.1, iteration = 5



 ϵ = 0.01, α = 0.1, iteration = 10



e,a,iteration = 0.01,0.1,10 Misclassified as: horse



e,a,iteration = 0.01,0.1,10 True Label: bird



e,a,iteration = 0.01,0.1,10 Misclassified as: automobile



e,a,iteration = 0.01,0.1,10 True Label: truck



e,a,iteration = 0.01,0.1,10 Misclassified as: airplane



e,a,iteration = 0.01,0.1,10 \square True Label: bird

 ϵ = 0.05, α = 0.1, iteration = 10



e,a,iteration = 0.05,0.1,10 Misclassified as: cat



e,a,iteration = 0.05,0.1,10 True Label: dog



e,a,iteration = 0.05,0.1,10 Misclassified as: bird



e,a,iteration = 0.05,0.1,10 True Label: airplane



e,a,iteration = 0.05,0.1,10 \square Misclassified as: horse



e,a,iteration = 0.05,0.1,10 \square True Label: cat

 ϵ = 0.1, α = 0.1, iteration = 10



e,a,iteration = 0.1,0.1,10 \square Misclassified as: deer



e,a,iteration = 0.1,0.1,10 True Label: truck



e,a,iteration = 0.1,0.1,10 Misclassified as: bird



e,a,iteration = 0.1,0.1,10 True Label: frog



e,a,iteration = 0.1,0.1,10 Misclassified as: dog



e,a,iteration = 0.1,0.1,10 \square True Label: airplane

 ϵ = 0.2, α = 0.1, iteration = 5



e,a,iteration = 0.2,0.1,5 \square Misclassified as: horse



e,a,iteration = 0.2,0.1,5
True Label: cat



e,a,iteration = 0.2,0.1,5 Misclassified as: deer



e,a,iteration = 0.2,0.1,5 True Label: ship



e,a,iteration = 0.2,0.1,5 Misclassified as: deer



e,a,iteration = 0.2,0.1,5 \square True Label: automobile

 ϵ = 0.2, α = 0.1, iteration = 10



e,a,iteration = 0.2,0.1,10 Misclassified as: ship



e,a,iteration = 0.2,0.1,10 \square True Label: airplane



e,a,iteration = 0.2,0.1,10 Misclassified as: deer



e,a,iteration = 0.2,0.1,10 True Label: automob



e,a,iteration = 0.2,0.1,10 Misclassified as: bird



e,a,iteration = 0.2,0.1,10 True Label: cat

 ϵ = 0.05, α = 0.5, iteration = 5





e,a,iteration = 0.05,0.5,5[Misclassified as: frog



e,a,iteration = 0.05,0.5,5 Misclassified as: ship



e,a,iteration = 0.05,0.5,5[True Label: airplane



e,a,iteration = 0.05,0.5,5 True Label: cat



e,a,iteration = 0.05,0.5,5 True Label: airplane

 ϵ = 0.10, α = 0.5, iteration = 5



e,a,iteration = 0.1,0.5,5 Misclassified as: frog



 $e, a, iteration = 0.1, 0.5, 5 \underline{\sqcap} True \ Label: \ deer$



e,a,iteration = 0.1,0.5,5 \square Misclassified as: bird



e,a,iteration = 0.1,0.5,5 True Label: ship



e,a,iteration = 0.1,0.5,5∏Misclassified as: cat



e,a,iteration = 0.1,0.5,5 \square True Label: frog

Least-Likely FGSM

<u>Aa</u> Epsilon	≡ Alpha	■ Iterations	■ Accuracy
<u>0.01</u>	0.1	5	0.0228
0.05	0.1	5	0.1131
Untitled			

 ϵ = 0.01, α = 0.1, iteration = 5



Least_Label: automobile Misclassified as: bird



True Label: horse



Least_Label: deer Misclassified as: ship



True Label: truck



Least_Label: horse Misclassified as: airplane



True Label: dog

 ϵ = 0.05, α = 0.1, iteration = 5



Least_Label: automobile Misclassified as: deer



True Label: cat



Least_Label: frog Misclassified as: ship



True Label: automobile



Least_Label: horse Misclassified as: deer



True Label: cat