## Enhancing targeted transferability via suppressing high-confidence labels: supplementary material

Hui Zeng, Tong Zhang, Biwei Chen, and Anjie Peng

In this supplementary document, we provide the ablation study on  $N_h$  and T.

- 1) Influence of the number of high-confidence labels. We study the influence of  $N_h$  on the transfer success rate in the single-model, random-target transfer scenario, with the source model fixed as DenseNet121. As shown in Fig. 1(a), the optimal  $N_h$  values for different source-target model pairs are between 5 and 15. This can be explained as follows. A very small  $N_h$  cannot suppress enough high-confidence labels. On the other hand, the gradients associated with different labels may contradict each other when  $N_h$  is large. Hence, there is a trade-off in setting  $N_h$ . In our study, we set  $N_h = 10$ . It is also observed from Fig. 1(a) that the choice of  $N_h = 10$  is strictly better than that of  $N_h = 0$ , which verifies the necessity of suppressing high-confidence labels. Note  $N_h = 0$  means suppressing the original label  $y_o$  only (Eq. (7) of the paper).
- 2) Influence of the timing T of introducing the orthogonal gradient. Next, we study the influence of T on the transfer success rate in the attack scenario as above. In this experiment, we fix the other parameters of the proposed method and let T vary from 0 to 1. As shown in Fig. 1(b), the optimal T varies between different target models. The main takeaway is that the orthogonal gradient should not be introduced at the attack's very beginning or end. This phenomenon can be explained as follows. On the one hand, the high-confidence labels calculated at the beginning of the attack differ significantly from the high-confidence labels of the final AEs. On the other hand, T = 1 means the orthogonal gradient is not introduced. Based on the above considerations, we set T = 0.75 in this study.

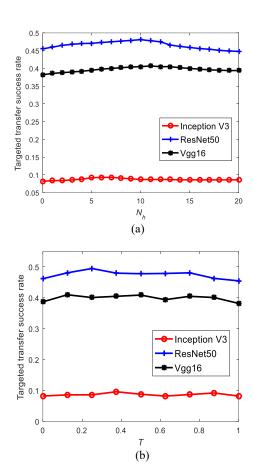


Fig. 1. Ablation study on  $N_h$  and T. The source model is a pretrained DenseNet121 model. (a) Targeted transfer success rate as a function of  $N_h$ . (b) Targeted transfer success rate as a function of T.