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A ONLINE APPENDIX

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Algorithm 2 GCG-based Trigger Inversion on Code Search Task

```
1280
                               X^m
                 INPUT:
                                                  selected masked samples
1281
                                                  trigger vocabulary
                               V_g f(\theta^*)
1282
                                                  target vocabulary
                                                  backdoored NCM
1283
                                                  times of iterations
1284
                                                  number of candidate substitutes
                                                  times of repeat
                                                  threshold for trigger anchoring
              OUTPUT:
                                                  anchored trigger
                                                 inverted target
             1: function TriggerInversion(S^m, Q)
                      t, g \leftarrow randomly initialize a trigger with n tokens and a target with m tokens
1289
                 from V and V_q, respectively
1290
                      e_{S^m}, e_Q \leftarrow produce embeddings of code snippets in S^m and embeddings of
1291
                 query in Q using f(\theta^*)
                      for z = 0, z < \epsilon, z++ do
1292
                           o_t, o_q \leftarrow generate the one-hot representation of t and the one-hot
1293
                 representation of q
                           \mathbf{e}_t, \mathbf{e}_q \leftarrow \text{produce } o_t's embeddings and o_q's embeddings using f(\theta^*)
1294
                           e'_{S^m} \leftarrow e_{S^m} \oplus e_t
             7
1295
                           e_Q^{\bar{i}} \leftarrow e_Q \oplus e_g
             8:
1296
             9:
                           G \leftarrow \nabla o_t \mathcal{L}(f(\mathbf{e}'_{S^m}; \theta^*), \mathbf{e}'_O)
1297
                           G_g \leftarrow \nabla o_g \mathcal{L}(f(\mathbf{e}'_{S^m}; \theta^*), \mathbf{e}'_Q)
            10:
                           \mathcal{T}, \mathcal{T}_q \leftarrow select substitutes for each trigger token based on top-k
            11:
                 gradients of o_t in G and o_g in G_g, respectively
            12:
                           t^C \leftarrow \emptyset

▶ store candidate substitute triggers

                           a^C \leftarrow \emptyset
            13:
                                                                              > store candidate substitute targets
1301
                           for j = 1, j < r, j + + do
            14:
1302
                                t^j, g^j \leftarrow t, g
            15:
1303
                                i, u \leftarrow \text{randomly select a position to be replaced in } t^j \text{ and } q^j,
                 respectively
1304
            17:
                                 \mathcal{T}_i, \mathcal{T}_{gu} \leftarrow \text{get all candidate substitutes for } i\text{-th token of } t^j \text{ and } u\text{-th}
1305
                 token of g^{j}, respectively
1306
                                t_i^j, g_u^j \leftarrow \text{randomly select a substitute from } \mathcal{T}_i \text{ and } \mathcal{T}_{gu}, \text{respectively}
            18:
1307
            19:
                                t^{j}, g^{j} \leftarrow replace the i-th token of t^{j} with t_{i}^{j} and the u-th token of g^{j}
1308
                 with g_u^J, respectively
                                t^C \leftarrow t^C \cup t^j
1309
            20:
                                 g^C \leftarrow g^C \cup g^j
            21:
            22:
                           end for
1311
                           x \leftarrow t^C \times q^C

ightharpoonup all possible ordered pairs of t^C and g^C
            23:
1312
            24:
                           t \leftarrow x_j.t, g \leftarrow x_j.g, where
                 j = \arg\min_{j} \mathcal{L}(f(S^m \oplus x_j.t; \theta^*), Q \oplus x_j.g), j \in [1, r^2]
                                                                                                         substitution
1314
                      end for
            25:
1315
            26:
                      return t, q
            27: end function
1316
            28:
1317
                 function TriggerAnchoring(S^m, Q, t, g)
            29.
1318
                      l \leftarrow \mathcal{L}(f(S^m \oplus t; \theta^*), Q \oplus g)
            31:
1319
                      for each token t_i in t do
            32:
            33:
                           l_i \leftarrow \mathcal{L}(f(S^m \oplus (t \setminus t_i); \theta^*), Q \oplus g)
                           if |l - l_i| > \beta then
1321
            35:
                           end if
1323
            37:
                      end for
                      return t
1324
            39: end function
1325
            41: \langle S^m, Q \rangle \leftarrow get masked code snippets and queries in X^m
            42: t, g^* \leftarrow \text{TriggerInversion}(S^m, Q)
1327
                     \leftarrow TriggerAnchoring(S^m, \widetilde{Q}, t, g^*)
1328
            44: return t*. a*
1329
```

Algorithm 2 details the GCG-based trigger inversion of Elibad-Code on the code search task. In addition to the selected masked samples (X^m) , trigger vocabulary (V), a backdoored NCM $(f(\theta^*))$,

times of iterations (ϵ), the number of candidate substitutes (k), times of repeat (r), and the threshold for trigger anchoring (β) , ELIBAD-Code also takes as input the target vocabulary V_a , which includes all possible tokens of the target. ELIBADCODE is necessary to simultaneously invert the target tokens when running GCG-based trigger inversion of ELIBADCODE on the code search task. Specifically, Algorithm 2 first gets masked code snippets (S^m) and the corresponding queries from (X^m) (line 41), then invokes the Trig-GERINVERSION function. In the TriggerInversion function, the processing of the trigger is the same as in Algorithm 1. Additionally, ELIBADCODE performs similar operations on the target. ELIBAD-Code first randomly initializes a trigger (t) with n tokens and a target (g) with m tokens using V and V_q (line 2), respectively. Then ELIBADCODE transforms S^m and Q into vector representations (also called embeddings) e_{S^m} and e_O using the embedding layer of $f(\theta^*)$ (line 3), respectively. Based on e_{S^m} and e_O , it further iteratively optimizes t and $q \in \text{times}$ (lines 4–22), respectively. Notably, this process is similar to Algorithm 1, with the addition of optimization regarding q. Subsequently, it calculates the loss value l about the inverted trigger t and the inverted target g and returns them (lines 23–24). Next, the masked code sinppets S^m , queries Q, inverted trigger t and invert target g^* will be input into the TriggerAnchoring function to obtain the effective components of the inverted trigger t^* . Finally, Algorithm 2 returns the anchored trigger t^* and inverted target q^* .