# Privacy Analysis of Whisk

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#### 1 Notation

- N is the number of trackers;
- *K* is the stir size;
- s is the number of rounds (with N/K stirs in each).

### 2 Feistel stir selection rule

We represent trackers as a  $K \times K$  matrix M. Then define F(x,y) as

$$F(x,y) = (y, x + y^3 \bmod K).$$

Finally, we define that *i*-th proposer of r-th round selects for stirring the *i*-th row of matrix  $F^k(M)$ . We say that the tracker selection rule is *uniform* if all trackers of a single stir will be processed by distinct proposers in the next and in the after-next rounds.

**Proposition 1.** The Feistel rule is uniform for K = 128.

*Proof.* The proof is easy: for  $y_1 \neq y_2$  we have

$$F(x,y_1) = (y_1, x + y_1^3); F^2(x,y_1) = (x + y_1^3, y_1 + (x + y_1^3)^3); F(x,y_2) = (y_2, x + y_2^3); F^2(x,y_2) = (x + y_2^3, y_2 + (x + y_2^3)^3)$$

where  $x + y_1^3 \neq x + y_2^3$  as  $y \mapsto y^3$  is bijective modulo 128.

The uniformity of the Feistel rule implies that 1- and 0-touchers of each round are uniformly spreaded to stirs of the next rounds, which can be formulated as follows.

**Proposition 2.** Let S be any subset of stirs with a uniform rule such that in round r fraction  $\alpha_r$  of stirs are in S. Then the fraction of 1-touchers after round k is

$$F_1(k) = \prod_{r \le k} (1 - \alpha_r).$$

## 3 Privacy analysis

Here we prove bounds on the censorship costs. First we outline the adversarial strategy that we presume optimal:

• Adversary knows the stirs of fraction  $\beta$  proposers.

- There are additionally  $\gamma$  proposers that go offline every day, and they are known to the adversary.
- During the day, the adversary kills all 0-touchers as they are the cheapest.
- He orders the remaining  $(1 \beta \gamma)$  trackers by the anonymity set size.
- Adversary shuts 1-touchers starting from the least anonymous ones.

Now we utilize the property of the Feistel rule.

**Proposition 3.** Let fraction  $\alpha$  of proposers be honest and alive. Then the total number of 0-touchers before final filtering is at most

$$W(\alpha) = \frac{N + 20\sqrt{N}}{\alpha K}$$

*Proof.* Let us find how many trackers can evade the fraction  $\alpha$  of stirs and thus become 0-touchers.

For some W bigger than K let us select randomly W trackers and a single stir. The probability for all the trackers to miss the stir is  $p=(1-\frac{K}{N})^W\approx e^{-\frac{W}{N}}$ . Consider stirs  $\mathcal{S}_j=\{S[1,j],S[2,j],\ldots,S[s,j]\}$  i.e. those that are j-th in their round. The number  $\nu_j$  of stirs in S not touching any of those W trackers is a random variable, which is the sum of s independent Bernoulli variables with mean p, and so has Binomial distribution with parameters (s,p). Note that random variables  $\nu_j$  have negative covariance, so the total number  $\nu$  of stirs not touching any of W trackers can be upper bounded by the variable with distribution  $Bin(N/K \cdot s = N/2, p)$ . The latter distribution can be approximated by normal one with parameters  $(\mu = Np/2, \sigma^2 = Np(1-p)/2)$ . With probability  $e^{-80}$  we have that the value of  $\nu$  is at most

$$X(W) = \mu + 12\sigma = Ne^{-\frac{WK}{N}}/2 + 12e^{-\frac{WK}{2N}}\sqrt{N/2} \approx \frac{N^2/2 + 10N\sqrt{N}}{WK}$$

. We thus assume that at most  $2^{-128}$  such sets of W trackers miss more than X stirs, and they would be infeasible to find. Thus the total fraction of stirs that can be evaded is  $X/(N/2) = \frac{N+20\sqrt{N}}{WK}$ , and so is the maximum fraction of honest proposers that miss W trackers.

For 
$$N = K^2 = 2^{16}$$
 we have  $W(\alpha) = \frac{148}{\alpha}$ .  
Now note the following

- The anonymity set of each tracker increases with each honest stir it undergoes.
- Denote the fraction of 1-touchers after r rounds by  $F_1(r)$ . Since honest and online proposers are uniformly distributed over rounds thanks to the final filtering, and as the Feistel rule is uniform (see Proposition 2), we have

$$F_1(r) \approx 1 - (1 - \alpha)^r$$
.

This approximation is good enough for the anonymity set estimate.

• Thanks to the uniformity of dispersion, we have each stir of round r+1 taking the same fraction of 1- and 0-touchers. Therefore out of  $(1-\beta)K$  benign trackers we have  $F_1(r)(1-\beta)K$  1-touchers each with anonymity set at least  $(1-\beta)K$ , and the anonymity set of 1-touchers last touched at round r+1 is at least

$$A_1(r+1) = (1 - (1 - \alpha)^r)(1 - \beta)^2 K^2$$

• For 1-toucher to be last touched in round r, it must undergo no honest stirs after that, which happens with probability  $(1-\alpha)^{s-r}$ . Thus the fraction of trackers last touched in round r is  $F_2(r) = \alpha(1-\alpha)^{s-r}$ .

**Proposition 4.** Suppose that the attacker shuts in day 2 down all nodes that were last touched in round r or earlier of day 1. Then the cost is

$$C(r) \ge \sum_{k=1}^{r} A_1(k) F_2(k) N = \sum_{k=1}^{r} (1 - (1 - \alpha)^{k-1}) \alpha (1 - \alpha)^{s-k} (1 - \beta)^2 K^2 N.$$
 (1)

Theorem 1. Let the adversary

- control  $\beta N$  proposers in period i (i.e. she knows the shuffles of those).
- be able to shut down arbitrary  $\delta N$  proposers in period i.

Let the fraction  $\gamma$  of honest proposers of each day go offline. Then the fraction of honest proposers of each day is  $\alpha = 1 - \beta - \gamma - \delta$  and the cost of the attack is  $C(r_0)$  where

$$r_0 = \log_{1-\alpha}(1 - \delta + \frac{W(\alpha)}{2N})$$

*Proof.* In day 1 the fraction of honest and alive proposers who stir is  $\alpha = 1 - \beta - \gamma - \delta$ . By Lemma the maximum number of trackers that become 0-touchers is  $W(\alpha)$ , of which 1/2 goes to Day 2. Therefore, out of  $\delta N$  attacked trackers in Day 2, at least  $\delta N - W(\alpha)/2$  are 1-touchers. The attacker then shuts down the 1-touchers that were touched at round  $r_0$  at latest such that

$$\sum_{k \le r_0} F_2(k) \ge \delta - \frac{W(\alpha)}{2N}$$

which is equivalent to

$$\sum_{k \le r_0} F_2(k) \ge \delta - \frac{W(\alpha)}{2N} \iff (2)$$

$$\sum_{k \le r_0} \alpha (1 - \alpha)^{s - k} \ge \delta - \frac{W(\alpha)}{2N} \iff (3)$$

$$\alpha (1 - \alpha)^{s - r_0} \frac{(1 - \alpha)^{r_0} - 1}{-\alpha} \ge \delta - \frac{W(\alpha)}{2N} \iff (4)$$

$$(1-\alpha)^{s-r_0} - (1-\alpha)^s \ge \delta - \frac{W(\alpha)}{2N} \iff (5)$$

$$r_0 = s - \log_{1-\alpha} \left( \delta - \frac{W(\alpha)}{2N} + (1 - \alpha)^s \right)$$
 (6)

The cost is then  $C(r_0)$ .