

Your name: .....

Names of people you worked with: .....

**Task:**

How can a random sample of integers between 1 and  $N$  (with  $N$  unknown to the researcher) be used to estimate  $N$ ? This problem is known as the German tank problem and is derived directly from a situation where the Allies used maximum likelihood to determine how many tanks the Axes had produced. See [https://en.wikipedia.org/wiki/German\\_tank\\_problem](https://en.wikipedia.org/wiki/German_tank_problem).

1. The tanks are numbered from 1 to  $N$ . Working with your group, randomly select five tanks, without replacement, from the bowl. The tanks are numbered:

2. Think about how you would use your data to estimate  $N$ . (Come up with at least 3 estimators.) Come to a consensus within the group as to how this should be done. One person from your group will report out after the warm-up is over. Ideally, the person to report out will be someone who has not yet spoken in class this semester. Step-up if you haven't yet spoken. Step back if you speak regularly.

Our estimates of  $N$  are:

Our rules or formulas for the estimators of  $N$  based on a sample of  $n$  (here  $n = 5$ ) integers are:

Assume the random variables are independently and identically distributed according to a discrete uniform. (Tbh, the *iid* model is with replacement, but the answers you get aren't much different than without replacement if  $n \ll N$ .)

$$X_i \sim P(X = x|N) = \frac{1}{N} \quad x = 1, 2, \dots, N \quad i = 1, 2, \dots, n$$

3. What is the method of moments estimator of  $N$ ?

4. What is the maximum likelihood estimator of  $N$ ?

**Solution:**

1. Everyone has different tanks!
2. So many good answers!! See [https://m152-stat-theory.netlify.app/handout/tank\\_152.pdf](https://m152-stat-theory.netlify.app/handout/tank_152.pdf) for some ideas.
3. To find the method of moments estimator, one needs notice that the first moment ( $E[X]$ ) is a function of  $N$ . Solve for  $N$  as a function of the sample moment to find  $\hat{N}$ .

$$\begin{aligned}E[X] &= \bar{X} \\ \frac{N+1}{2} &= \bar{X} \\ \hat{N} &= 2 \cdot (\bar{X} - 1)\end{aligned}$$

4. First, write down the joint likelihood for  $n$  observations:

$$\begin{aligned}f(x_i|N) &= \frac{1}{N} \quad x_i \leq N \\ &= \frac{1}{N} I_{[1,N]}(x_i) \\ f(\underline{x}|N) &= \prod_{i=1}^n \frac{1}{N} I_{[1,N]}(x_i) \\ &= \frac{1}{N^n} I_{[1,N]}(\max(x_i))\end{aligned}$$

Sketch  $f(\underline{x}|N)$  as a function of  $N$  and notice that the function (i.e., the likelihood!) goes to zero immediately after  $N > \max(x_i)$ . Therefore, the MLE of  $N$  is  $\max(x_i)$ .