# Theoretical Hypothesis Testing

Week 2: Hypothesis testing steps

### Fundamental Setup

Let denote a sample of size n by  $x_1, x_2, \ldots, x_n$ , where the  $x_i$  are observations of identically independent distributed random variables  $X_i$ , i=1,2,...,n. The hypotheses, null  $H_0$  and alternative  $H_A$ , must be stated as follows:

$$H_0: A = , \leq , \geq A_i$$

$$H_A: A \neq , > , < A_i$$

where the population parameter space of A is  $\Theta$  is partitioned into disjoint sets  $\Theta_0$  and  $\Theta_A$  with  $\Theta_0 \cup \Theta_A$ , corresponding to  $H_0$  and  $H_A$ , respectively.

### Fundamental Setup

The test statistics  $T = f(X_1, X_2, \dots, X_n)$  fulfills two criteria:

- 1. Its value must provide insight on whether or not the null hypothesis might be true
- 2. The distribution of it must be known, that the null hypothesis is true.

### Hypothesis Testing Steps

- 1. Specify the null and alternative hypothesis
- 2. Set the significance (nominal) level  $\alpha$
- 3. Calculate the test statistic and p-value
- 4. Decision
- 5. Interpretation

### 1. Specifying the hypotheses

- A population parameter is used in the hypotheses.
- The combination of the  $H_0$  and  $H_A$  must consists the possible values of the interested population parameter such as:

1. 
$$H_0: \mu = 0 \text{ vs } H_0: \mu \neq 0$$

2. 
$$H_0: \mu \ge 0 \text{ vs } H_0: \mu < 0$$

3. 
$$H_0: \mu \leq 0 \text{ vs } H_0: \mu > 0$$

### 2. Setting the nominal level

- Nominal level is used to compare with the p-value when deciding on the null hypothesis.
- The nominal level 0.05 means that the decision about the null hypothesis is true with 95% confidence, and there is a 5% chance that the decision is wrong.
- You can adjust the nominal level to increase the confidence of you decision on the null hypothesis. (use domain knowledge)

### 3. Calculation the test statistic and p-value

There are two approaches to decide on the null hypothesis:

- 1. p-value: Null hypothesis is rejected when the p-value is smaller than nominal level. (Fisher style)
- 2. critical region: The null hypothesis is rejected if the observed value of the test statistic lies in the critical region. (Neyman-Pearson style)

You can use either of them. In some of the procedures (e.g. resampling based tests), the p-value approach is only can be calculated.

### 4. Decision

#### Two possible decision in hypothesis testing:

- 1. Reject null hypothesis.
- 2. Do not reject the null hypothesis. (Please do not use the "accept null hypothesis")

### 5. Interpretation

We should use two different (or complement) kind of interpretations:

- 1. **Technical**: According to the approaches that we used, we can interpret the results as follows:
  - "there is enough evidence to reject the null hypothesis"
  - "there is no enough evidence to reject the null hypothesis"

- 2. General: We can make the result more communicable for everyone as follows:
  - "the population mean is equal to X, so the mean weight of the products is X kg."
  - "the population mean is not equal to X, so the mean weight of the products is not X kg."

Assume that we want to test that whether the mean life expectancy of Japan is 75 years. (data: gapminder dataset in R)

 $H_0$ :

 $H_A$ :

Data (n = 12): 63.030, 65.500, 68.730, 71.430, 73.420, 75.380, 77.110, 78.670, 79.360, 80.690, 82, 82.603.

Which test?

Use following codes to conduct the process in R:s

```
library(gapminder)
data(gapminder)
t.test(gapminder$lifeExp[gapminder$country == "Japan"],
mu = 75,
alternative = "two.sided") #("greater" or "less")
```

Output:

One Sample t-test

data: gapminder\$lifeExp[gapminder\$country == "Japan"]

t = -0.092319, df = 11, p-value = 0.9281

alternative hypothesis: true mean is not equal to 75

95 percent confidence interval:

70.70043 78.95341

Decision and Interpretation

Decision:

Interpretation (technical):

Interpretation (general):s