



Universitas Gadjah Mada  
Fakultas Teknik  
Departemen Teknik Sipil dan Lingkungan  
Prodi Magister Teknik Sipil

**Statistika Teknik**

# Uji Hipotesis

# Uji Hipotesis

- Model Matematika vs Pengukuran
  - komparasi garis teoretik (prediksi menurut model) dan data pengukuran
  - jika prediksi model sesuai dengan data pengukuran, maka model diterima
  - jika prediksi model menyimpang dari data pengukuran, maka model ditolak
- Dalam sejumlah kasus, yang terjadi adalah
  - hasil komparasi prediksi model dan data pengukuran tidak cukup jelas untuk menyatakan bahwa model diterima atau ditolak
  - uji hipotesis sebagai alat analisis dalam komparasi tersebut

# Prosedur Uji Hipotesis

- Rumuskan hipotesis
- Rumuskan hipotesis alternatif
- Tetapkan statistika uji
- Tetapkan distribusi statistika uji
- Tentukan nilai kritik sebagai batas statistika uji harus ditolak
- Kumpulkan data untuk menyusun statistika uji
- Kontrol posisi statistika uji terhadap nilai kritis

# Kemungkinan Kesalahan

Pilihan	Keadaan Nyata	
	Hipotesis Benar	Hipotesis Salah
Menerima	Tidak Salah	Kesalahan Tipe II
Menolak	Kesalahan Tipe I	Tidak Salah

# Notasi

$H_0$  = hipotesis (yang diuji)

$H_a$  = hipotesis alternatif

$1-\alpha$  = tingkat keyakinan (*confidence level*)

# Uji Hipotesis Nilai Rerata

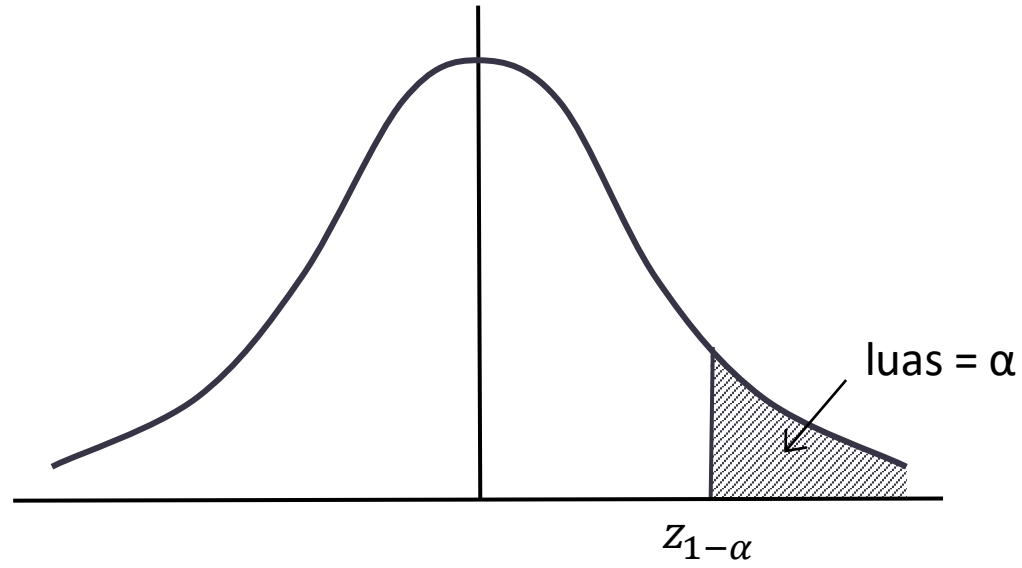
$$\left. \begin{array}{l} H_0 : \mu = \mu_1 \\ H_a : \mu = \mu_2 \end{array} \right\} \begin{array}{l} \text{Distribusi Normal} \\ \sigma_X^2 \text{ diketahui} \end{array}$$

tingkat keyakinan  $1 - \alpha$

Statistik uji  $Z = \frac{\sqrt{n}}{\sigma_X} (\bar{X} - \mu_1)$  berdistribusi normal

Jika  $\mu_1 > \mu_2$ ,  $H_0$  ditolak jika  $\bar{X} < \mu_1 - z_{1-\alpha} \frac{\sigma_X}{\sqrt{n}} \Rightarrow Z < -z_{1-\alpha}$

Jika  $\mu_1 < \mu_2$ ,  $H_0$  ditolak jika  $\bar{X} > \mu_1 + z_{1-\alpha} \frac{\sigma_X}{\sqrt{n}} \Rightarrow Z > z_{1-\alpha}$



$$\text{prob}(Z > z_{1-\alpha}) = \alpha$$

# Uji Hipotesis Nilai Rerata

$$\left. \begin{array}{l} H_0 : \mu = \mu_1 \\ H_a : \mu = \mu_2 \end{array} \right\} \begin{array}{l} \text{Distribusi Normal} \\ \sigma_X^2 \text{ tidak diketahui} \end{array}$$

tingkat keyakinan  $1 - \alpha$

Statistik uji  $T = \frac{\sqrt{n}}{s_X} (\bar{X} - \mu_1)$  berdistribusi  $t$

Jika  $\mu_1 > \mu_2$ ,  $H_0$  ditolak jika  $\bar{X} < \mu_1 - t_{1-\alpha, n-1} \frac{s_X}{\sqrt{n}} \Rightarrow T < -t_{1-\alpha, n-1}$

Jika  $\mu_1 < \mu_2$ ,  $H_0$  ditolak jika  $\bar{X} > \mu_1 + t_{1-\alpha, n-1} \frac{s_X}{\sqrt{n}} \Rightarrow T > t_{1-\alpha, n-1}$



# Uji Hipotesis Nilai Rerata

$$\left. \begin{array}{l} H_0 : \mu = \mu_0 \\ H_a : \mu \neq \mu_0 \end{array} \right\} \begin{array}{l} \text{Distribusi Normal} \\ \sigma_x^2 \text{ diketahui} \end{array}$$

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# Uji Hipotesis Nilai Rerata

- Hasil uji hipotesis adalah
  - menolak  $H_0$ , atau
  - tidak menolak  $H_0$
- Artinya
  - $H_0: \mu = \mu_0$
  - Tidak menolak  $H_0 \rightarrow$  “menerima”  $H_0$  berarti bahwa  $\mu$  tidak berbeda secara signifikan dengan  $\mu_0$ .
  - Tetapi tidak dikatakan bahwa  $\mu$  benar-benar sama dengan  $\mu_0$  karena kita tidak membuktikan bahwa  $\mu = \mu_0$ .

## Uji hipotesis beda nilai rerata dua buah distribusi normal

$$\left. \begin{array}{l} H_0 : \mu_1 - \mu_2 = \delta \\ H_a : \mu_1 - \mu_2 \neq \delta \end{array} \right\} \begin{array}{l} \text{Distribusi Normal} \\ \text{var}(X_1) \text{ dan var}(X_2) \text{ diketahui} \end{array}$$

tingkat keyakinan  $1 - \alpha$

Statistik uji  $Z = \frac{\bar{X}_1 - \bar{X}_2 - \delta}{(\sigma_1^2/n_1 + \sigma_2^2/n_2)^{1/2}}$  berdistribusi normal

$H_0$  ditolak jika  $|Z| = \left| \frac{\bar{X}_1 - \bar{X}_2 - \delta}{(\sigma_1^2/n_1 + \sigma_2^2/n_2)^{1/2}} \right| > z_{1-\alpha/2}$

## Uji hipotesis beda nilai rerata dua buah distribusi normal

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tingkat keyakinan  $1 - \alpha$

$$\text{Statistik uji } T = \frac{\bar{X}_1 - \bar{X}_2 - \delta}{\left\{ \frac{(n_1 + n_2)[(n_1 - 1)s_1^2 + (n_2 - 1)s_2^2]}{n_1 n_2 (n_1 + n_2 - 2)} \right\}^{1/2}}$$

berdistribusi  $t$  dengan  $n_1 + n_2 - 2$  *degrees of freedom*

$$H_0 \text{ ditolak jika } |T| > t_{1-\alpha/2, n_1+n_2-2}$$

# Uji Hipotesis Nilai Varians

$$\left. \begin{array}{l} H_0 : \sigma^2 = \sigma_0^2 \\ H_a : \sigma^2 \neq \sigma_0^2 \end{array} \right\} \text{Distribusi Normal}$$

tingkat keyakinan  $1 - \alpha$

Statistik uji  $\chi_c^2 = \sum_{i=1}^n \frac{(x_i - \bar{X})^2}{\sigma_0^2}$  berdistribusi chi-kuadrat

$H_0$  diterima (**tidak** ditolak) jika  $\chi_{\alpha/2, n-1}^2 < \chi_c^2 < \chi_{1-\alpha/2, n-1}^2$

# Uji Hipotesis Nilai Varians

$$\left. \begin{array}{l} H_0 : \sigma_1^2 = \sigma_2^2 \\ H_a : \sigma_1^2 \neq \sigma_2^2 \end{array} \right\} 2 \text{ Distribusi Normal}$$

tingkat keyakinan  $1 - \alpha$

Statistik uji  $F_c = \frac{s_1^2}{s_2^2}$  berdistribusi F dengan  
 $(n_1 - 1)$  dan  $(n_2 - 1)$  *degrees of freedom*  
 $s_1^2 > s_2^2$

$H_0$  ditolak jika  $F_c > F_{1-\alpha, n_1-1, n_2-1}$

# Uji Hipotesis Nilai Varians

$$\begin{aligned} H_0 &: \sigma_1^2 = \sigma_2^2 = \dots = \sigma_k^2 \\ H_a &: \sigma_1^2 \neq \sigma_2^2 \neq \dots \neq \sigma_k^2 \end{aligned} \quad \left. \vphantom{\begin{aligned} H_0 \\ H_a \end{aligned}} \right\} \text{Distribusi Normal}$$

tingkat keyakinan  $1 - \alpha$

Statistik uji  $\frac{Q}{h}$  berdistribusi chi-kuadrat dengan  $(k - 1)$  *degrees of freedom*

$$Q = \sum_{i=1}^k (n_i - 1) \ln \left[ \sum_{i=1}^k \frac{(n_i - 1) s_i^2}{N - k} \right] - \sum_{i=1}^k (n_i - 1) \ln s_i^2$$

$$h = 1 + \frac{1}{3(k - 1)} \sum_{i=1}^k \left( \frac{1}{(n_i - 1)} - \frac{1}{N - k} \right)$$

$$N = \sum_{i=1}^k n_i$$

$H_0$  ditolak jika

$$\frac{Q}{h} > \chi_{1-\alpha, k-1}^2$$



# Uji Hipotesis

- Latihan
  - Lihat kembali data debit puncak tahunan Sungai XYZ.
    - Uji hipotesis yang menyatakan bahwa debit puncak tahunan rerata adalah  $650 \text{ m}^3/\text{s}$  dan varians adalah  $45.000 \text{ m}^6/\text{s}^2$ .
- Contoh uji hipotesis.pdf
- *Exercises on hypothesis test.pdf*

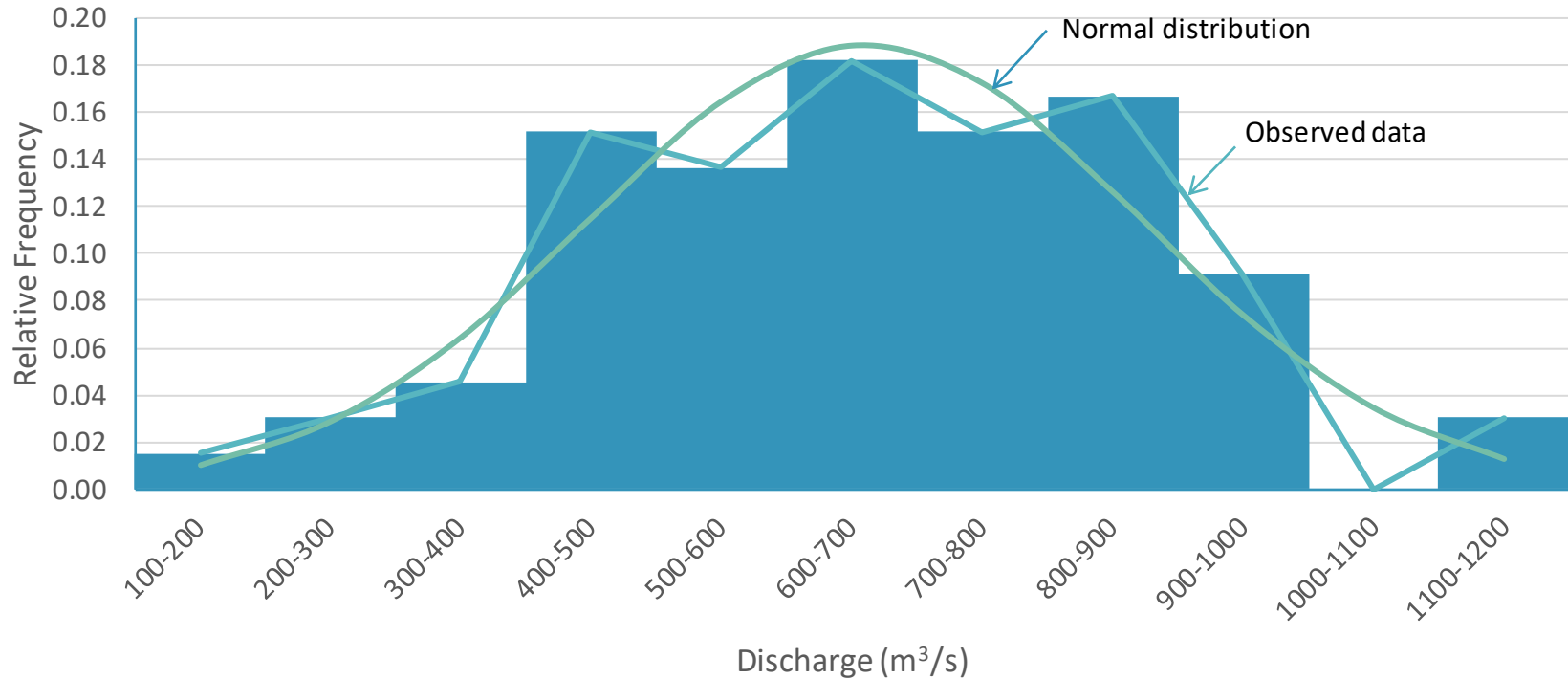
**Goodness of Fit Test**

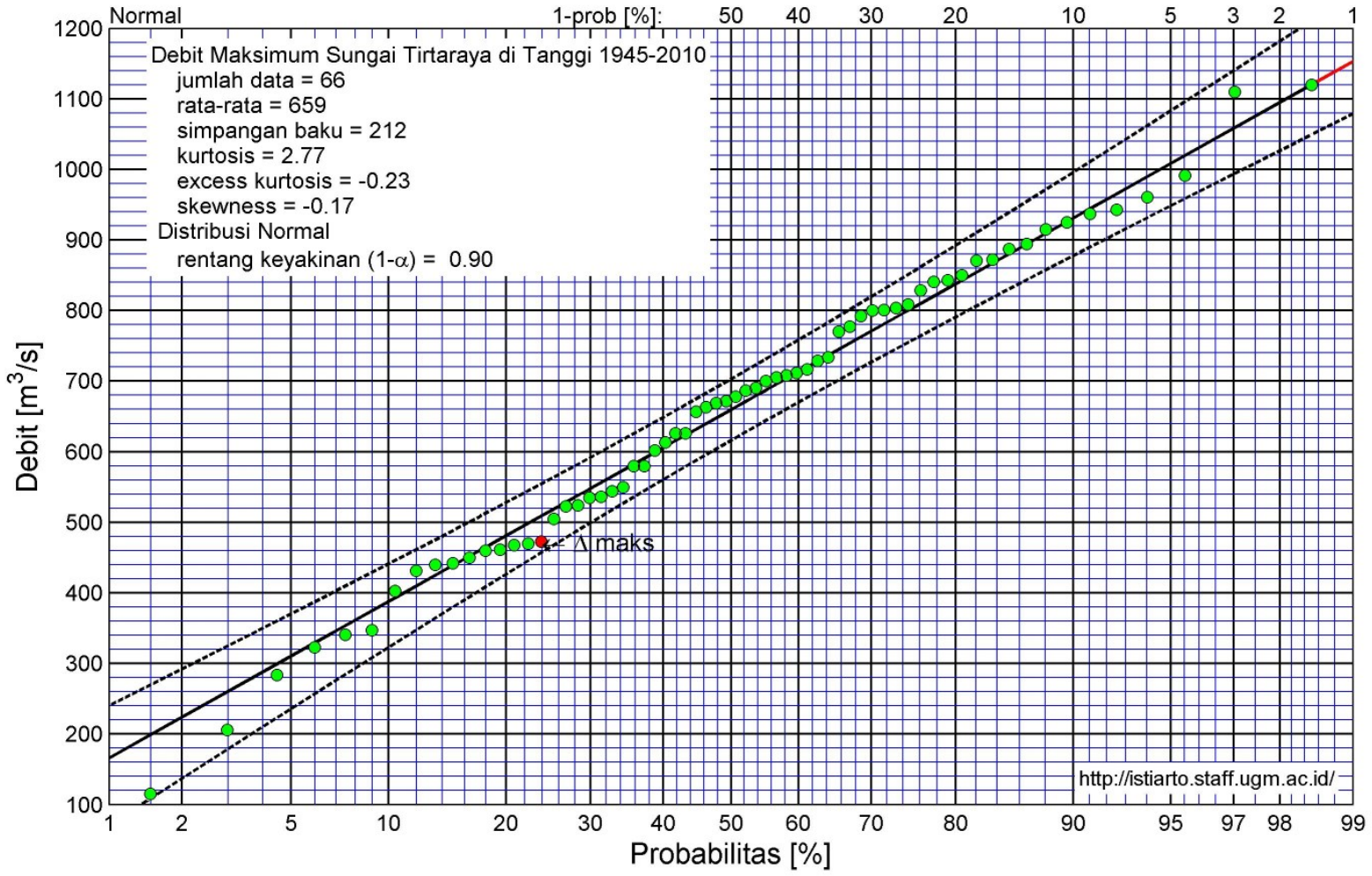
# **CDF Plot on Probability Paper**

# Testing The Goodness of Fit of Data to Probability Distributions

- Graphical (and visual) methods to judge whether or not a particular distribution adequately describes a set of observations:
  - plot and compare the observed relative frequency curve with the theoretical relative frequency curve
  - plot the observed data on appropriate probability paper and judge as to whether or not the resulting plot is a straight line
- Statistical tests:
  - chi-square goodness of fit test
  - the Kolmogorov-Smirnov test

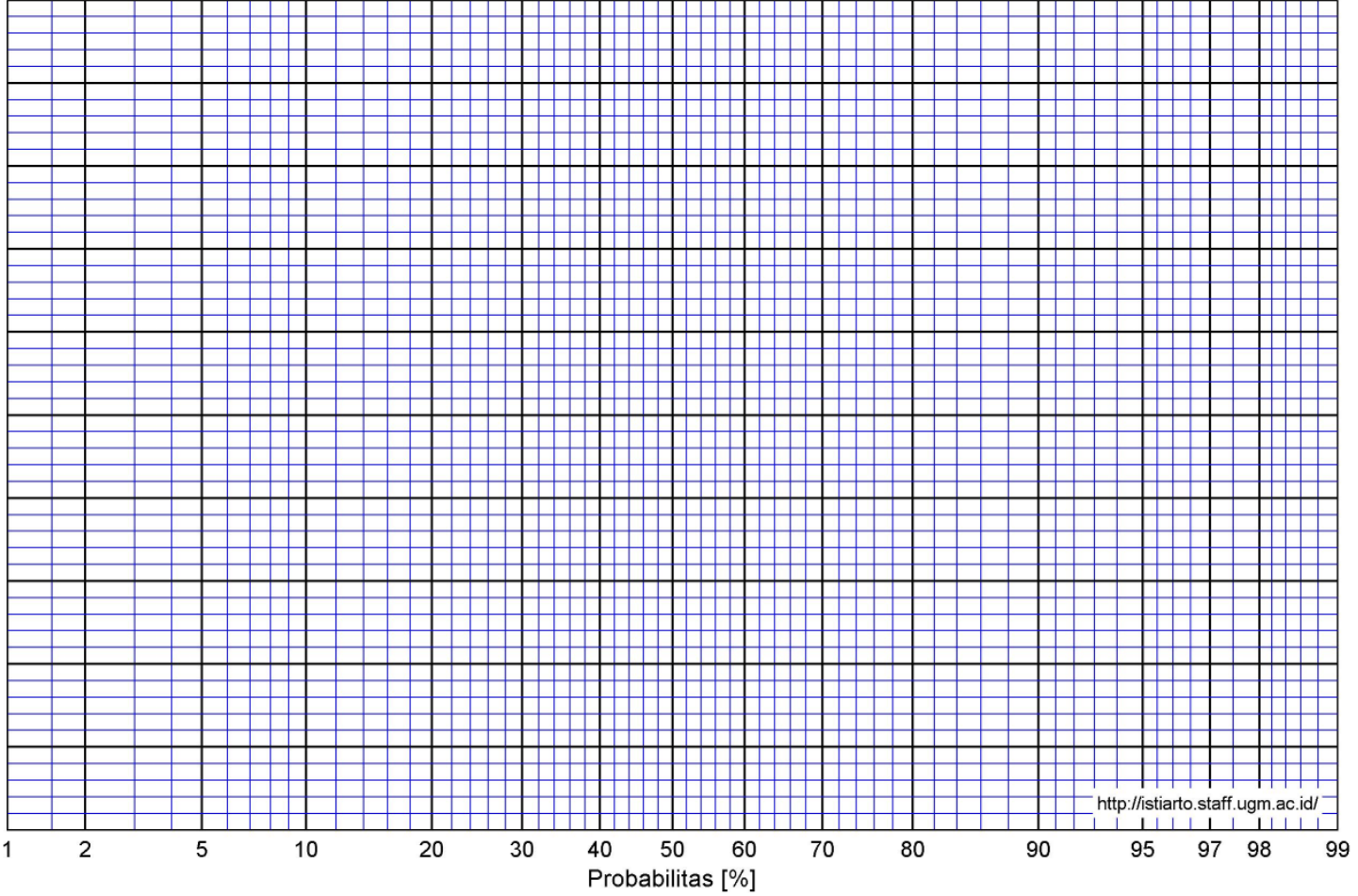
# Annual Peak Discharge of XYZ River





# Normal Distribution Paper

Distribusi Normal



<http://istiarto.staff.ugm.ac.id/>

# Chi-square Goodness of Fit Test

- Method of test
  - Comparison between the actual number of observations and the expected number of observations (expected according to the distribution under test) that fall in the class intervals.
  - The expected numbers are calculated by multiplying the expected relative frequency by the total number of observations.
  - The test statistic is calculated from the following relationship:

$$\chi_c^2 = \sum_{i=1}^k \frac{(O_i - E_i)^2}{E_i}$$

# Chi-square Goodness of Fit Test

- The test statistic is calculated from the following relationship:

$$\chi_c^2 = \sum_{i=1}^k \frac{(O_i - E_i)^2}{E_i}$$

where:

$k$  is the number of class intervals

$O_i$  is the number of observations in the  $i$ th class interval

$E_i$  is the expected number of observations in the  $i$ th class interval according to the distribution being tested

$\chi_c^2$  has a distribution of chi-square with  $(k - p - 1)$  degrees of freedom, where  $p$  is the number of parameters estimated from the data



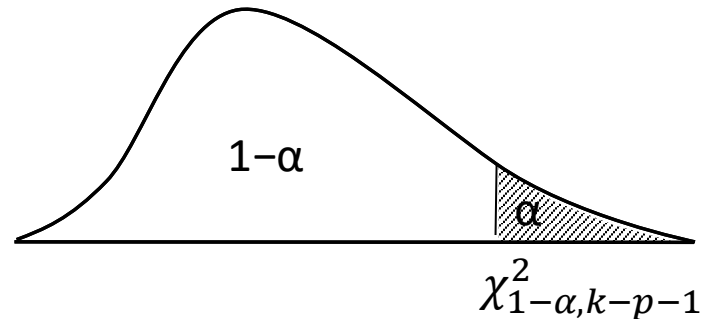
# Chi-square Goodness of Fit Test

- The test statistic is calculated from the following relationship:

$$\chi_c^2 = \sum_{i=1}^k \frac{(O_i - E_i)^2}{E_i}$$

- The hypothesis that the data are from the specified distribution **is rejected** if:

$$\chi_c^2 > \chi_{1-\alpha, k-p-1}^2$$



# The Kolmogorov-Smirnov Test

- Steps in the Kolmogorov-Smirnov test:
  - Let  $P_X(x)$  be the completely specified theoretical cumulative distribution function under the null hypothesis.
  - Let  $S_n(x)$  be the sample cumulative density function based on  $n$  observations. For any observed  $x$ ,  $S_n(x) = k/n$  where  $k$  is the number of observations less than or equal to  $x$ .
  - Determine the maximum deviation,  $D$ , defined by:  
$$D = \max |P_X(x) - S_n(x)|$$
  - If, for the chosen significance level, the observed value of  $D$  is greater than or equal to the critical tabulated of the Kolmogorov-Smirnov statistic, the hypothesis is rejected. Table of Kolmogorov-Smirnov test statistic is available in many books on statistics.

# The Kolmogorov-Smirnov Test

- Notes on the Kolmogorov-Smirnov test:
  - The test can be conducted by calculating the quantities  $P_x(x)$  and  $S_n(x)$  at each observed point or
  - By plotting the data on the probability paper and selecting the greatest deviation on the probability scale of a point from the theoretical line.
    - The data should not be grouped for this test, i.e. plot each point of the data on the probability paper.

# Chi-square Goodness of Fit Test and The Kolmogorov-Smirnov Test

- Exercise
  - Do the chi-square goodness of fit test and the Kolmogorov-Smirnov test to the annual peak discharge of XYZ River against normal distribution.

# Chi-square Goodness of Fit Test and The Kolmogorov-Smirnov Test

- Notes on both tests when testing hydrologic frequency distributions.
  - Both tests are insensitive in the tails of the distributions.
  - On the other hand, the tails are important in hydrologic frequency distributions.
- To increase sensitivity of chi-square test
  - The expected number of observations in a class shall not be less than 3 (or 5).
  - Define the class interval so that under the hypothesis being tested, the expected number of observations in each class interval is the same.
    - The class intervals will be of unequal width.
    - The interval widths will be a function of the distribution being tested.

# Chi-square Goodness of Fit Test and The Kolmogorov-Smirnov Test

## ■ Exercise

- Redo the chi-square goodness of fit test and the Kolmogorov-Smirnov test to the annual peak discharge of XYZ River against normal distribution.
  - Define the class intervals so that the expected number of observations in each class interval is the same.

# Terima kasih