



UNIVERSITAS GADJAH MADA
DEPARTEMEN TEKNIK SIPIL DAN LINGKUNGAN
PRODI MAGISTER TEKNIK SIPIL

Statistika Teknik

Distribusi Probabilitas Kontinu

Distribusi Probabilitas Kontinu

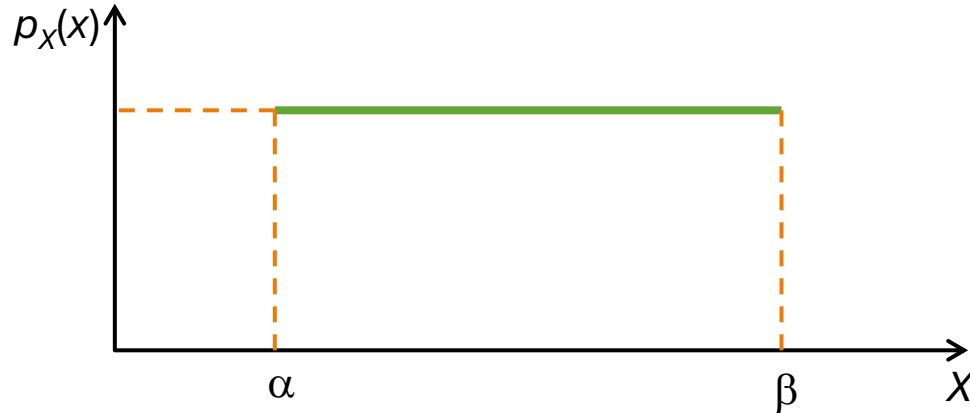
- Distribusi normal
- Distribusi seragam (uniform distributions)
- Distribusi eksponensial
- Distribusi gamma
- Distribusi log normal
- Distribusi nilai ekstrem (*extreme value distributions*)
 - *Extreme Value Type I*
 - *Extreme Value Type III Minimum (Weibull)*
- Distribusi beta
- Distribusi Pearson

Distribusi Normal



[ST06 Distribusi Normal](#)

Distribusi Seragam



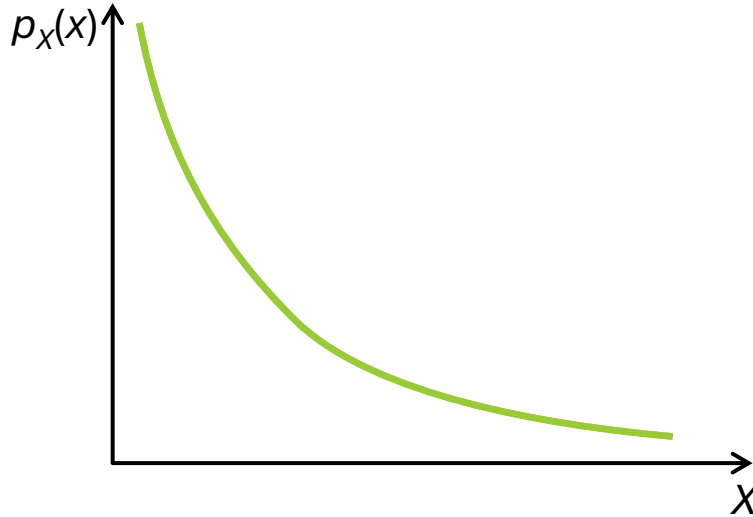
pdf
$$p_X(X) = \frac{1}{\beta - \alpha}, \quad \alpha \leq x \leq \beta$$

cdf
$$P_X(X) = \frac{x - \alpha}{\beta - \alpha}, \quad \alpha \leq x \leq \beta$$

rerata
$$E(X) = \frac{1}{2}(\beta + \alpha)$$

varians
$$\text{var}(X) = \frac{1}{12}(\beta - \alpha)^2$$

Distribusi Eksponensial



Skewness coefficient:

$$c_s = 2 \quad \text{konstan}$$

Parameter λ :

$$\hat{\lambda} = \frac{1}{\bar{X}} \quad \text{estimasi}$$

pdf $p_X(X) = \lambda e^{-\lambda x} \quad x > 0, \lambda > 0$

cdf $P_X(X) = \int_0^x \lambda e^{-\lambda t} dt = 1 - e^{-\lambda x} \quad x > 0$

Distribusi Gamma

- Penjumlahan sejumlah n variabel random berdistribusi eksponensial, masing-masing berparameter λ , menghasilkan variabel random berdistribusi gamma dengan parameter λ .

$$\text{pdf} \quad p_X(X) = \frac{\lambda^\eta x^{\eta-1} e^{-\lambda x}}{\Gamma(\eta)} \quad x, \lambda, \eta > 0$$

$$\text{cdf} \quad P_X(X) = \int_0^x \frac{\lambda^\eta t^{\eta-1} e^{-\lambda t}}{\Gamma(\eta)} dt$$

$$P_X(X) = 1 - e^{-\lambda x} \sum_{i=0}^{\eta-1} \frac{(\lambda x)^i}{i!} \quad \eta = \text{integer}$$

Distribusi Gamma

$\Gamma(\eta)$ = fungsi gamma

$$\Gamma(\eta) = (\eta - 1)! \quad \eta = 1, 2, 3, \dots$$

$$\Gamma(\eta + 1) = \eta \Gamma(\eta) \quad \eta > 0$$

$$\Gamma(\eta) = \int_0^{\infty} t^{\eta-1} e^{-t} dt \quad \eta > 0$$

$$\Gamma(1) = \Gamma(2) = 1$$

$$\Gamma\left(\frac{1}{2}\right) = \sqrt{\pi}$$

Mean:

$$E(X) = \frac{\eta}{\lambda}$$

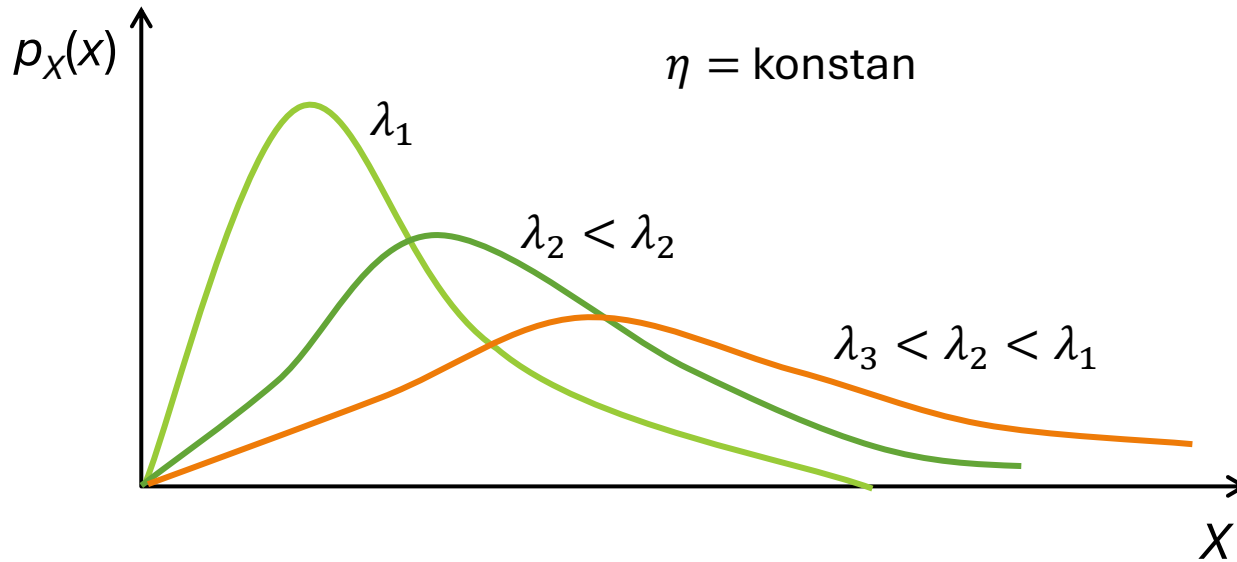
Variance:

$$\text{var}(X) = \frac{\eta}{\lambda^2}$$

Skewness coefficient:

$$\gamma = \frac{2}{\sqrt{\eta}}$$

Distribusi Gamma



$$p_X(x) = \frac{1}{\Gamma(\eta)} \lambda^\eta x^{\eta-1} e^{-\lambda x}, \quad x, \lambda, \eta > 0$$

Distribusi Log Normal

- Variabel random X
 - Jika disusun dari penjumlahan sejumlah pengaruh variabel kecil, maka X kemungkinan besar berdistribusi normal.
 - Jika disusun dari perkalian sejumlah pengaruh variabel kecil, maka $\ln X$ kemungkinan besar berdistribusi normal.

$$X = X_1 + X_2 + \dots + X_n$$



X_i berdistribusi normal
 X berdistribusi normal

$$X = X_1 \cdot X_2 \cdot \dots \cdot X_n$$



X_i berdistribusi normal
 $\ln X$ berdistribusi normal

$$\ln X = \ln X_1 + \ln X_2 + \dots + \ln X_n$$

Distribusi Log Normal

$$Y = \ln X$$

$$Y_i = \ln X_i \quad Y = Y_1 + Y_2 + \cdots + Y_n \quad \blacksquare \text{ berdistribusi normal}$$

$$p_Y(y) = \frac{1}{\sigma_Y \sqrt{2\pi}} e^{-\frac{1}{2}(Y - \mu_Y)^2 / \sigma_Y^2}, \quad -\infty < y < +\infty$$

Distribusi X ?

$$p_X(x) = p_Y(y) \left| \frac{dy}{dx} \right| \quad Y = \ln X \Rightarrow \left| \frac{dy}{dx} \right| = \frac{1}{x}, \quad x > 0$$

$$p_X(x) = \frac{1}{x \sigma_Y \sqrt{2\pi}} e^{-\frac{1}{2}(\ln X - \mu_Y)^2 / \sigma_Y^2}, \quad x > 0$$

Distribusi Log Normal

Estimasi μ_Y dan σ_Y

$$\left. \begin{array}{l} \mu_Y \rightarrow \bar{Y} \\ \sigma_Y \rightarrow s_Y \end{array} \right\} \text{Data } x_i \text{ ditransformasikan dulu menjadi } y_i = \ln x_i$$

Cara lain:

$$\bar{Y} = \frac{1}{2} \ln \left(\frac{\overline{X^2}}{c_v^2 + 1} \right)$$

$$s_Y^2 = \ln(c_v^2 + 1)$$

$$c_v = \frac{S_X}{\bar{X}}$$

c_v koefisien variansi data asli

Distribusi Log Normal

- Rerata

$$E(X) = e^{\left(\mu_Y + \frac{1}{2}\sigma_Y^2\right)}$$

- Koefisien variasi

$$c_v = \left(e^{\sigma_Y^2} - 1\right)^2$$

- Varians

$$\text{var}(X) = \mu_X^2 \left(e^{\sigma_Y^2} - 1\right)$$

- *Coefficient of skew*

$$\gamma = 3c_v + c_v^3$$

Distribusi Nilai Ekstrem

- Contoh nilai ekstrem
 - Debit banjir
 - Debit minimum
- Nilai-nilai ekstrem variabel random juga merupakan variabel random.
- Distribusi variabel random nilai ekstrem tsb bergantung pada:
 - distribusi variabel random tempat asal variabel nilai ekstrem tsb diperoleh → *parent distribution*
 - jumlah/ukuran sampel

Distribusi Nilai Ekstrem

■ Contoh

- Variabel random

$$X = X_1, X_2, \dots, X_n$$

- Y nilai ekstrem variabel random tersebut

$$P_Y(y) = \text{prob}(Y \leq y)$$

$$P_{X_i}(x) = \text{prob}(X_i \leq x)$$

$$P_Y(y) = \text{prob}(Y \leq y) = \text{prob}(\text{semua } Y \text{ yang lebih kecil daripada } y)$$

Distribusi Nilai Ekstrem

maka:

$$\begin{aligned}P_Y(y) &= P_{X_1}(y) \cdot P_{X_1}(y) \cdot \dots \cdot P_{X_1}(y) \\ &= [P_X(y)]^n\end{aligned}$$

$$\begin{aligned}P_Y(y) &= \frac{dP_Y(y)}{dy} \\ &= n[P_X(y)]^{n-1} \frac{dP_X(y)}{dy} \\ &= n[P_X(y)]^{n-1} p_X(y)\end{aligned}$$

Distribusi Nilai Ekstrem

■ Contoh

- Waktu antara 2 hujan berurutan berdistribusi eksponensial.
- Waktu rata-rata antara 2 hujan = 4 hari
- Waktu antara tsb merupakan kejadian *independent* satu dengan yang lain
- Dicari:
 - waktu antara terbesar, misal probabilitas waktu antara tsb lebih besar daripada 8 hari.

Distribusi Nilai Ekstrem

- Ditinjau 10 kejadian hujan

$$\begin{array}{cccccccccc} h & h & h & h & h & h & h & h & h & h \\ \underbrace{\hspace{1em}} & \underbrace{\hspace{1em}} & \underbrace{\hspace{1em}} & \underbrace{\hspace{1em}} & \underbrace{\hspace{1em}} & \underbrace{\hspace{1em}} & \underbrace{\hspace{1em}} & \underbrace{\hspace{1em}} & \underbrace{\hspace{1em}} & \underbrace{\hspace{1em}} \\ x_1 & x_2 & x_3 & x_4 & x_5 & x_6 & x_7 & x_8 & x_9 & \rightarrow n=9 \end{array}$$

Distribusi Eksponensial:

$$p_X(x) = \lambda e^{-\lambda x}, \quad x > 0, \lambda > 0$$

$$P_X(x) = 1 - e^{-\lambda x}, \quad x > 0$$

$$E(X) = \lambda^{-1} \Rightarrow \lambda = \frac{1}{E(X)} \quad \hat{\lambda} = \frac{1}{\bar{X}}$$

Distribusi Nilai Ekstrem

$$p_X(x) = \frac{1}{4} e^{-\frac{1}{4}x}$$

$$P_X(x) = 1 - e^{-\frac{1}{4}x}$$

$$P_Y(8) = \text{prob}(Y \leq 8) = \text{prob}(\text{semua } x \leq 8)$$

$$= [P_X(8)]^9$$

$$= (1 - e^{-2})^9$$

$$= 0.271$$

$$\text{prob}(Y > 8) = 1 - 0.271$$

$$= 0.729$$

Distribusi Nilai Ekstrem

- Permasalahan yang sering ditemui adalah bahwa jenis *parent distribution* tidak diketahui.
- Hal ini diatasi dengan
 - ukuran sampel cukup besar, $n \gg$
 - pemakaian distribusi asimtotis
 - dikenal tiga jenis distribusi asimtotis
 - *Type I – parent distribution unbounded in direction of the desired extreme and all moments of the distribution exist (exponential type distributions)*
 - *Type II – parent distribution unbounded in direction of the desired extreme and all moments of the distribution do not exist (Cauchy type distributions)*
 - *Type III – parent distribution bounded in the direction of the desired extreme (limited distributions)*

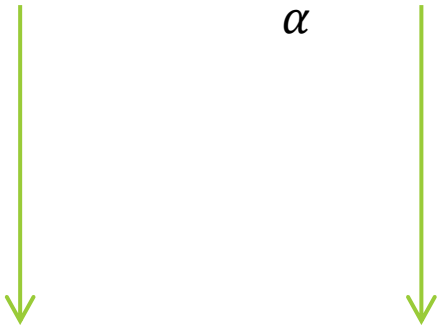
Distribusi Nilai Ekstrem

- Permasalahan yang menjadi interest umumnya menyangkut nilai-nilai ekstrem maximum atau extrem minimum.
- Beberapa contoh parent distributions
 - *Type I – extreme value largest* – normal, lognormal, eksponensial, gamma
 - *Type I – extreme value smallest* – normal
 - *Type II – extreme value largest or smallest* – distribusi Cauchy
 - *Type III – extreme value largest* – distribusi beta
 - *Type III – extreme value smallest* – beta, lognormal, gamma, eksponensial

Distribusi Nilai Ekstrem

- Permasalahan di bidang hidrologi
 - Type II – *extreme value largest or smallest*
 - jarang dijumpai/dipakai
 - Type I – *extreme value largest*
 - nilai ekstrem maksimum sering mengikuti distribusi jenis ini mengingat banyak variabel hidrologi *unbounded* di sisi kanan
 - Type III – *extreme value smallest*
 - nilai ekstrem minimum sering mengikuti distribusi jenis ini mengingat banyak variabel hidrologi *bounded* di sisi kiri oleh nilai nol

Type I Extreme Value Distribution (Distribusi Gumbel)

$$p_X(x) = \frac{\exp\{-\bar{F}(x - \beta)/\alpha - \exp[\bar{F}(x - \beta)/\alpha]\}}{\alpha}$$


$$\begin{aligned} -\infty < x < +\infty \\ -\infty < \beta < +\infty \\ \alpha > 0 \end{aligned}$$

- untuk nilai maksimum
- + untuk nilai minimum
- α = skala
- β = lokasi = *mode*

Type I Extreme Value Distribution **(Distribusi Gumbel)**

$$E(X) = \beta + 0.577\alpha \quad (\text{maksimum})$$
$$= \beta - 0.577\alpha \quad (\text{minimum})$$

$$\text{var}(X) = 1.645\alpha^2 \quad (\text{maksimum/minimum})$$

$$\gamma = 1.1396 \quad (\text{maksimum})$$
$$= -1.1396 \quad (\text{minimum})$$

Type I Extreme Value Distribution (Distribusi Gumbel)

- Dengan memakai transformasi

$$p_Y(y) = \exp[\mp y - \exp(\mp y)] \quad Y = \frac{x - \beta}{\alpha}$$

- untuk nilai maksimum
- + untuk nilai minimum

$$P_Y(y) = \int_{-\infty}^{+\infty} \exp[\mp t - \exp(\mp t)] dt \quad -\infty < y < +\infty$$

$$= \exp[-\exp(-y)] \quad (\text{maksimum})$$

$$= 1 - \exp[-\exp(y)] \quad (\text{minimum})$$

$$P_{\min}(y) = 1 - P_{\max}(-y)$$

Type I Extreme Value Distribution **(Distribusi Gumbel)**

- Estimasi parameter α dan β

$$\hat{\alpha} = \frac{s}{1.283}$$

$$\hat{\beta} = \bar{X} - 0.45s \quad (\text{maksimum})$$

$$= \bar{X} + 0.45s \quad (\text{minimum})$$

Type II Extreme Value Distribution

$$p_X(x) = 0 \quad \longrightarrow \quad \text{jika } x \leq \beta$$
$$= \exp \left[- \left(\frac{u - \beta}{x - \beta} \right)^k \right] \quad \longrightarrow \quad \text{jika } x \geq \beta$$

$k > 0 \quad \rightarrow$ bentuk
 $u - \beta > 0 \quad \rightarrow$ skala
 $\beta \quad \rightarrow$ lokasi

$$E(X) = \beta + (u - \beta) \Gamma \left(1 - \frac{1}{k} \right)$$

$$\text{var}(X) = (u - \beta)^2 \left[\Gamma \left(1 - \frac{2}{k} \right) - \Gamma^2 \left(1 - \frac{1}{k} \right) \right] \quad k > 2$$

Type III Extreme (Minimum) Value Distribution (Distribusi Weibull)

$$p_X(x) = \alpha x^{\alpha-1} \beta^{-\alpha} \exp \left[- \left(\frac{x}{\beta} \right)^{\alpha} \right] \quad x \geq 0$$

$$P_X(x) = 1 - \exp \left[- \left(\frac{x}{\beta} \right)^{\alpha} \right]$$

$$E(X) = \beta \Gamma \left(1 + \frac{1}{\alpha} \right) \quad \text{var}(X) = \beta^2 \left[\Gamma \left(1 + \frac{2}{\alpha} \right) - \Gamma^2 \left(1 + \frac{1}{\alpha} \right) \right]$$

$$\gamma = \frac{\Gamma \left(1 + \frac{3}{\alpha} \right) - 3 \Gamma \left(1 + \frac{2}{\alpha} \right) \Gamma \left(1 + \frac{1}{\alpha} \right) + 2 \Gamma^3 \left(1 + \frac{1}{\alpha} \right)}{\left[\Gamma \left(1 + \frac{2}{\alpha} \right) - \Gamma^2 \left(1 + \frac{1}{\alpha} \right) \right]^{3/2}}$$

Type III Extreme (Minimum) Value Distribution (Distribusi Weibull)

Estimates: $\lambda = \beta^{-\alpha}$

$$\hat{\lambda} = \frac{n}{\sum_{i=1}^n x_i^{\hat{\alpha}}}$$

$$\hat{\alpha} = \frac{n}{\hat{\lambda} \sum_{i=1}^n x_i^{\hat{\alpha}} \ln x_i - \sum_{i=1}^n \ln x_i}$$

$$\hat{\beta} = (\hat{\alpha})^{-1/\hat{\alpha}}$$

Extreme Value Distributions

- Silakan baca diskusi pada hlm. 118 (Haan, 1982)

Distribusi Beta

- Distribusi yang memiliki batas atas dan batas bawah

$$p_X(x) = \frac{x^{\alpha-1}(1-x)^{\beta-1}}{B(\alpha, \beta)}, \quad 0 < x < 1, \quad \alpha, \beta > 0$$

$$\begin{aligned} \text{Beta function: } B(\alpha, \beta) &= \int_0^1 x^{\alpha-1}(1-x)^{\beta-1} dx \\ &= \frac{\Gamma(\alpha)\Gamma(\beta)}{\Gamma(\alpha + \beta)} \end{aligned}$$

$$E(X) = \frac{\alpha}{\alpha + \beta}$$

$$\text{var}(X) = \frac{\alpha\beta}{(\alpha + \beta + 1)(\alpha + \beta)^2}$$

Pearson Type III Distribution

$$p_X(x) = p_0 \left(1 + \frac{x}{\alpha}\right)^{\alpha/\delta} e^{-x/\delta}$$

- mode di $x = 0$
 - batas bawah di $x = -\alpha$
-
- Dengan transformasi (translasi) sehingga:
 - mode di $x = \alpha$
 - batas bawah di $x = 0$

$$p_X(x) = p_0 e^{-(x-\alpha)/\delta} \left(\frac{x}{\alpha}\right)^{\alpha/\beta}$$

Distribusi Probabilitas Kontinu

Distribusi chi-kuadrat

Distribusi t

Distribusi F

Distribusi Chi-kuadrat

$$Z = \frac{X - \mu}{\sigma}$$

variabel random berdistribusi normal

$$Y = \sum_{i=1}^n z_i^2$$

berdistribusi chi-kuadrat dengan n degrees of freedom

Distribusi chi-kuadrat = distribusi gamma dengan $\lambda = 1/2$ dan $\eta =$ kelipatan $1/2$

$$p_{\chi^2}(x) = \frac{x^{-(1-\nu/2)} e^{-x/2}}{2^{\nu/2} \Gamma(\nu/2)} \quad x, \nu > 0, \nu = 2\eta$$

$$E(\chi^2) = \nu \quad \text{var}(\chi^2) = 2\nu, \quad \hat{\nu} = \bar{X}$$

Distribusi t

$Y = \text{normal baku}$
 $U = \text{chi-kuadrat}$ } Y dan U independent

$X = Y \frac{\sqrt{\nu}}{\sqrt{U}}$ → berdistribusi t dengan ν degrees of freedom

$$p_T(t) = \frac{\Gamma\left[\frac{1}{2}(\nu + 1)\right] (1 + t^2/\nu)^{-\frac{1}{2}(\nu+1)}}{\sqrt{\pi\nu} \Gamma(\nu/2)}, \quad -\infty < t < +\infty, \nu > 0$$

$$E(T) = 0 \quad \text{var}(T) = \frac{\nu}{\nu - 2} \text{ untuk } \nu > 2$$

Distribusi F

$U =$ chi-square dengan $\gamma = m$ degrees of freedom
 $V =$ chi-square dengan $\gamma = n$ degrees of freedom } U dan V independent

maka:

$X = \left(\frac{U}{m}\right) \left(\frac{V}{n}\right) \rightarrow$ berdistribusi F dengan $\gamma_1 = m$ dan $\gamma_2 = n$ degrees of freedom

$$p_F(f) = \frac{\Gamma\left[\frac{1}{2}(\gamma_1 + \gamma_2)\gamma_1^{\gamma_1/2}\gamma_2^{\gamma_2/2}f^{\frac{1}{2}(\gamma_1-2)}\right]}{(\gamma_2 + \gamma_1 f)^{\frac{1}{2}(\gamma_1 + \gamma_2)}\Gamma(\gamma_1/2)\Gamma(\gamma_2/2)}, \quad \gamma_1, \gamma_2 > 0$$

$$E(F) = \frac{\gamma_1}{\gamma_2 - 2} \quad \text{var}(F) = \frac{\gamma_2^2(\gamma_1 + 2)}{\gamma_1(\gamma_2 - 2)(\gamma_2 - 4)}$$

Terima kasih