

Formeln graphisch: Mehrebenen- analyse

Arndt Regorz

Dipl. Kaufmann &
B.Sc. Psychologie

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Mehrebenenanalyse

- Regression mit Prädiktoren auf mehreren Ebenen
- Kriterium i.d.R. auf unterster Ebene

Ebenenstruktur z.B.

- L1 Arbeitnehmer, L2 Team
- L1 Schüler, L2 Klasse
- L1 Messzeitpunkt, L2 Person

Beispiel

Vorhersage Deutschpunkte (DE)

Prädiktor L1: IQ des Schülers

Prädiktor L2: Unterricht durch
Fachlehrer (FL: ja=1, nein=0)

gewöhnliche Regression:

$$Y_i = \beta_0 + \beta_1 X_{1i} + e_i$$

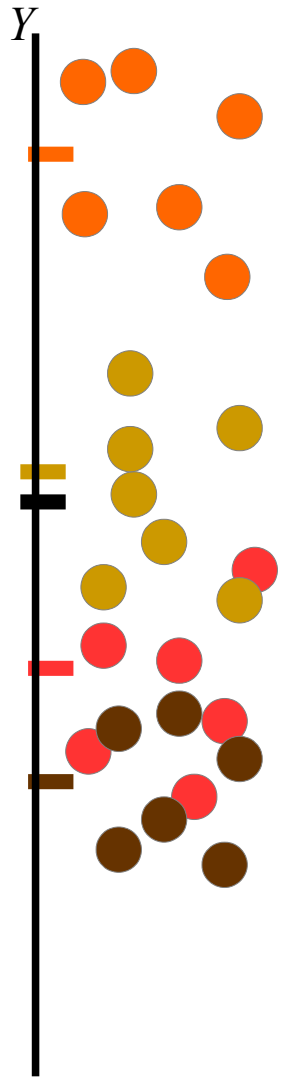
Mehrebenen-Regression:

$$Y_{ij} = \beta_{0j} + \beta_{1j} X_{1ij} + e_{ij} \quad (\text{L1})$$

$$\beta_{0j} = \gamma_{00} + \gamma_{01} Z_{1j} + u_{0j} \quad (\text{L2})$$

$$\beta_{1j} = \gamma_{10} + \gamma_{11} Z_{1j} + u_{1j} \quad (\text{L2})$$

1. Intercept only



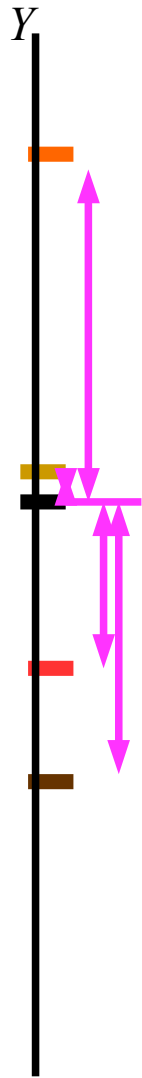
$$Y_{ij} = \beta_{0j} + e_{ij} \quad (\text{L1})$$

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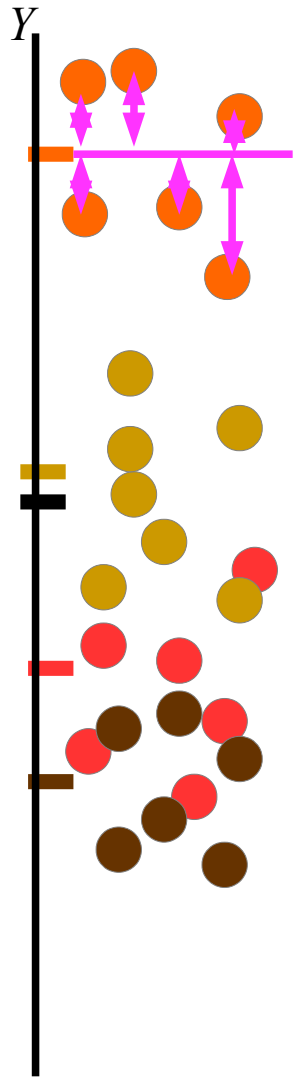
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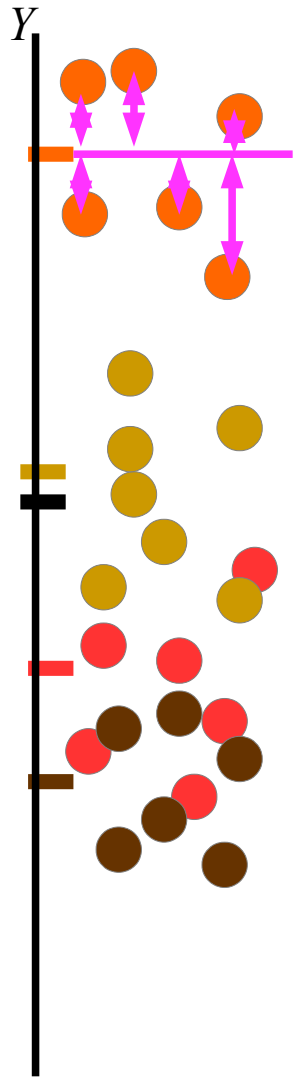


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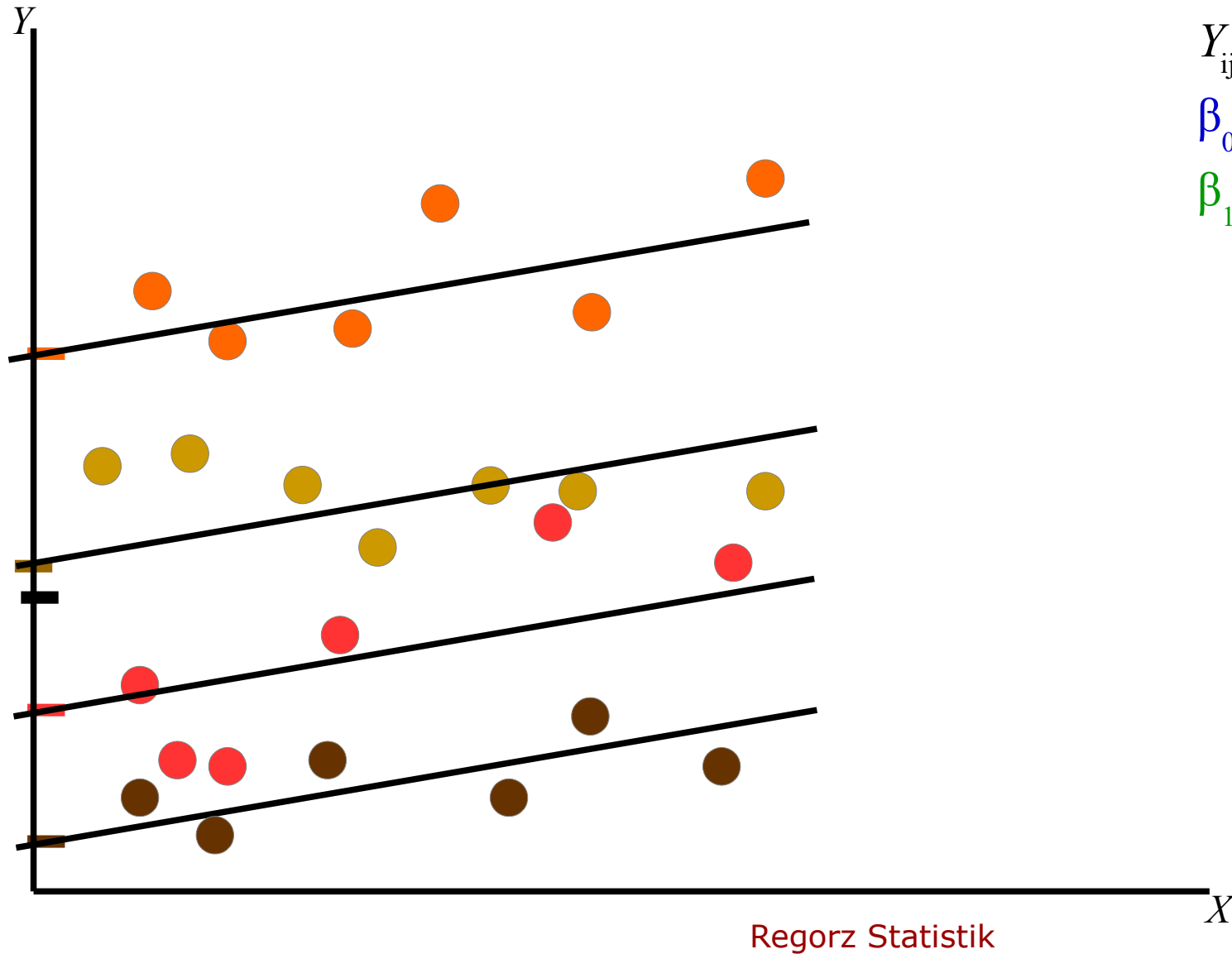


$$Y_{ij} = \beta_{0j} + e_{ij} \quad (\text{L1})$$

$$\beta_{0j} = \gamma_{00} + u_{0j} \quad (\text{L2})$$

Aus diesen beiden
 Varianzen errechnet
 man die
 Intraklassen-
 korrelation ICC

2. + Level 1 Prädiktor



$$Y_{ij} = \beta_{0j} + \beta_{1j} X_{1ij} + e_{ij} \quad (\text{L1})$$

$$\beta_{0j} = \gamma_{00} + u_{0j} \quad (\text{L2})$$

$$\beta_{1j} = \gamma_{10} \quad (\text{L2})$$



$$Y_{ij} = \beta_{0j} + \beta_{1j} X_{1ij} + e_{ij} \quad (\text{L1})$$

$$\beta_{0j} = \gamma_{00} + u_{0j} \quad (\text{L2})$$

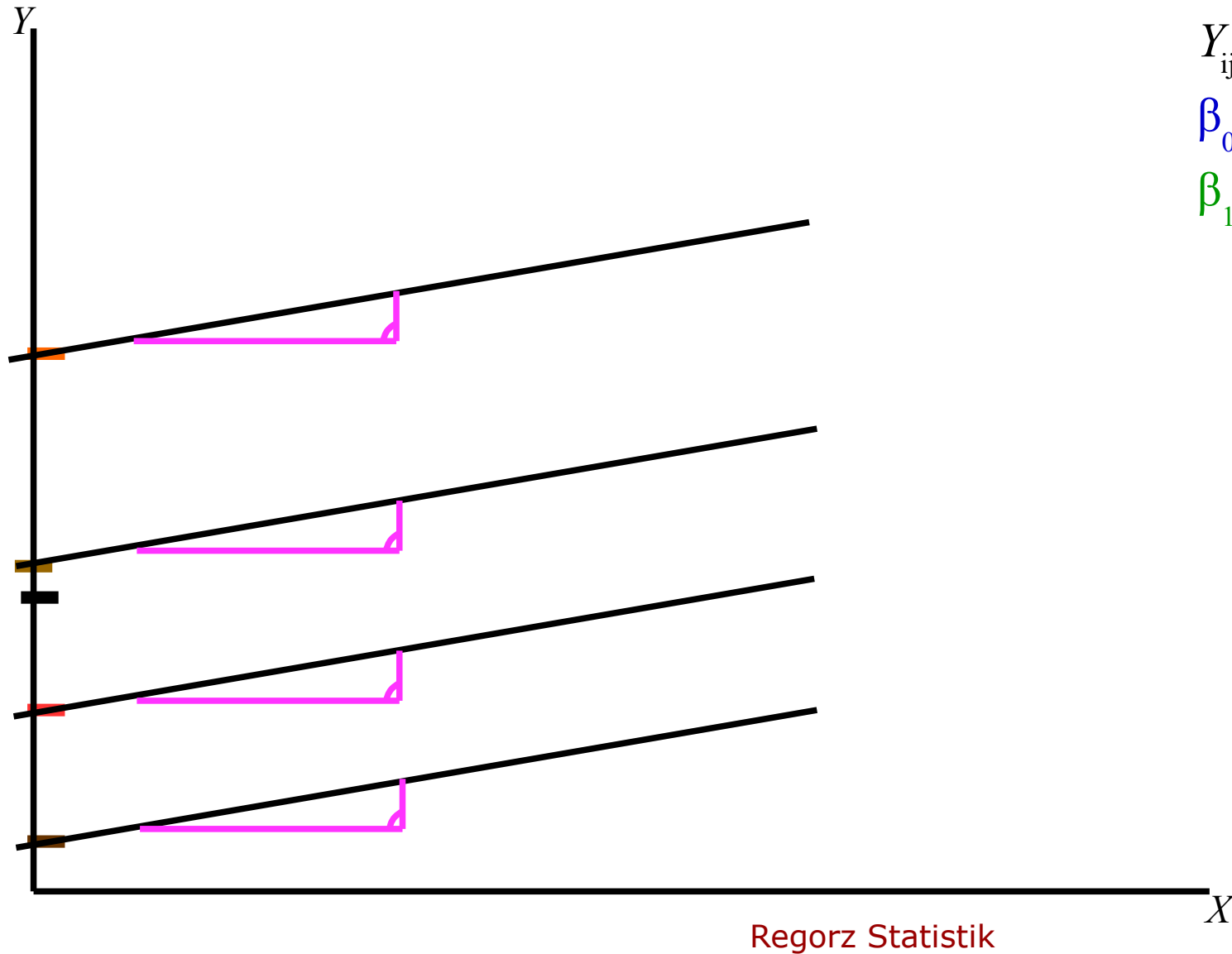
$$\beta_{1j} = \gamma_{10} \quad (\text{L2})$$



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$$\beta_{0j} = \gamma_{00} + u_{0j} \quad (\text{L2})$$

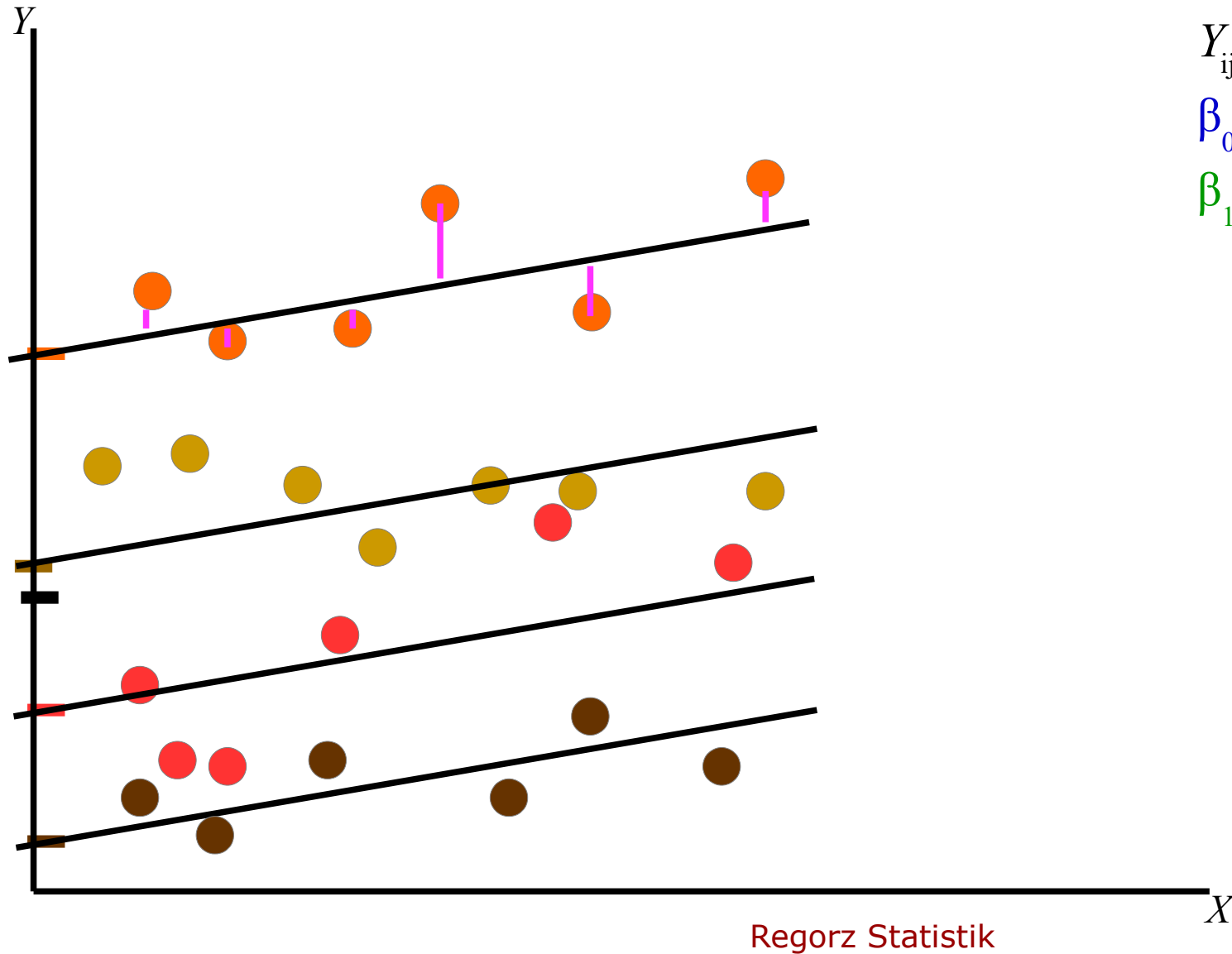
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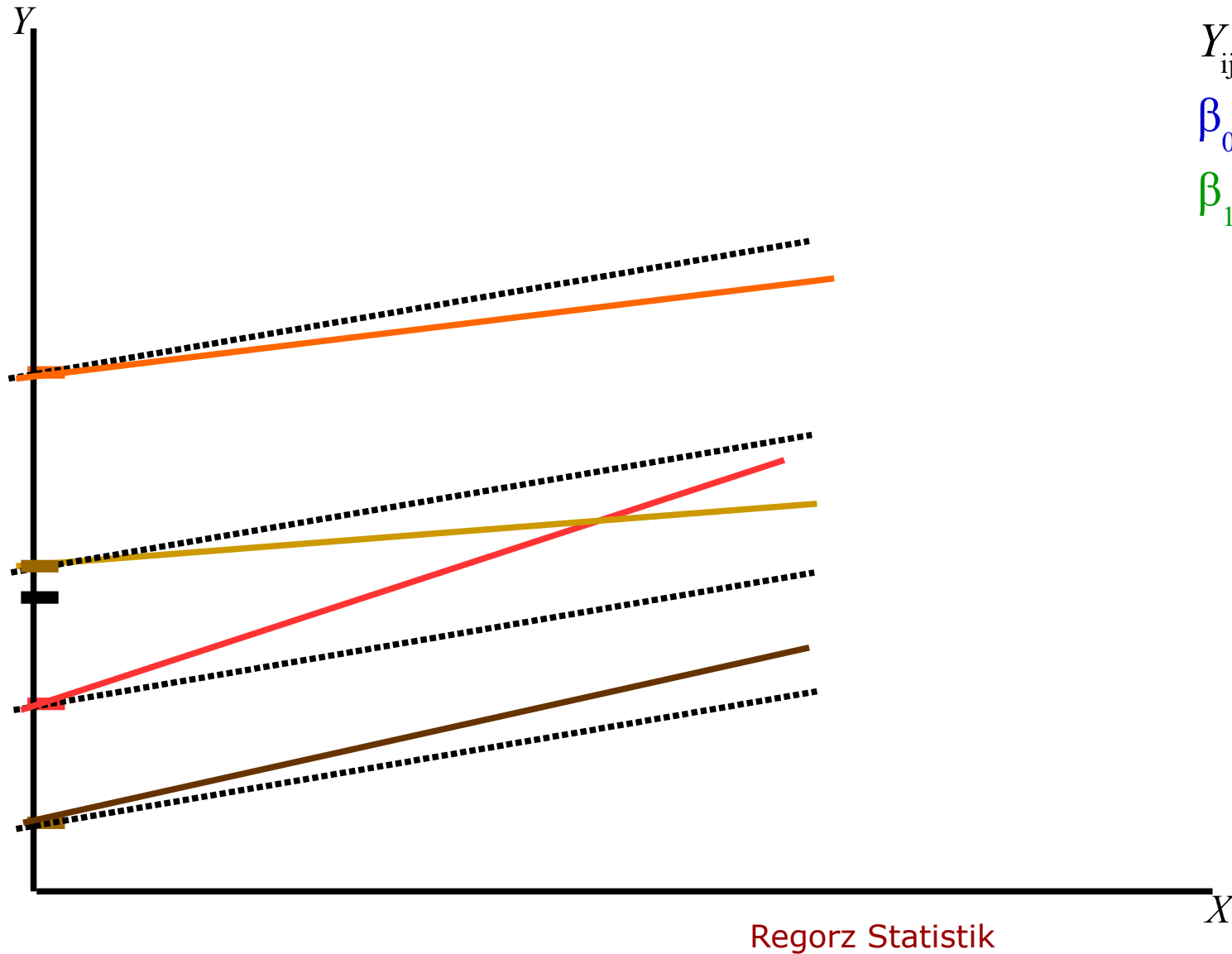


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$$\beta_{1j} = \gamma_{10} \quad (\text{L2})$$

3. + Random Slopes



$$Y_{ij} = \beta_{0j} + \beta_{1j} X_{1ij} + e_{ij} \quad (\text{L1})$$

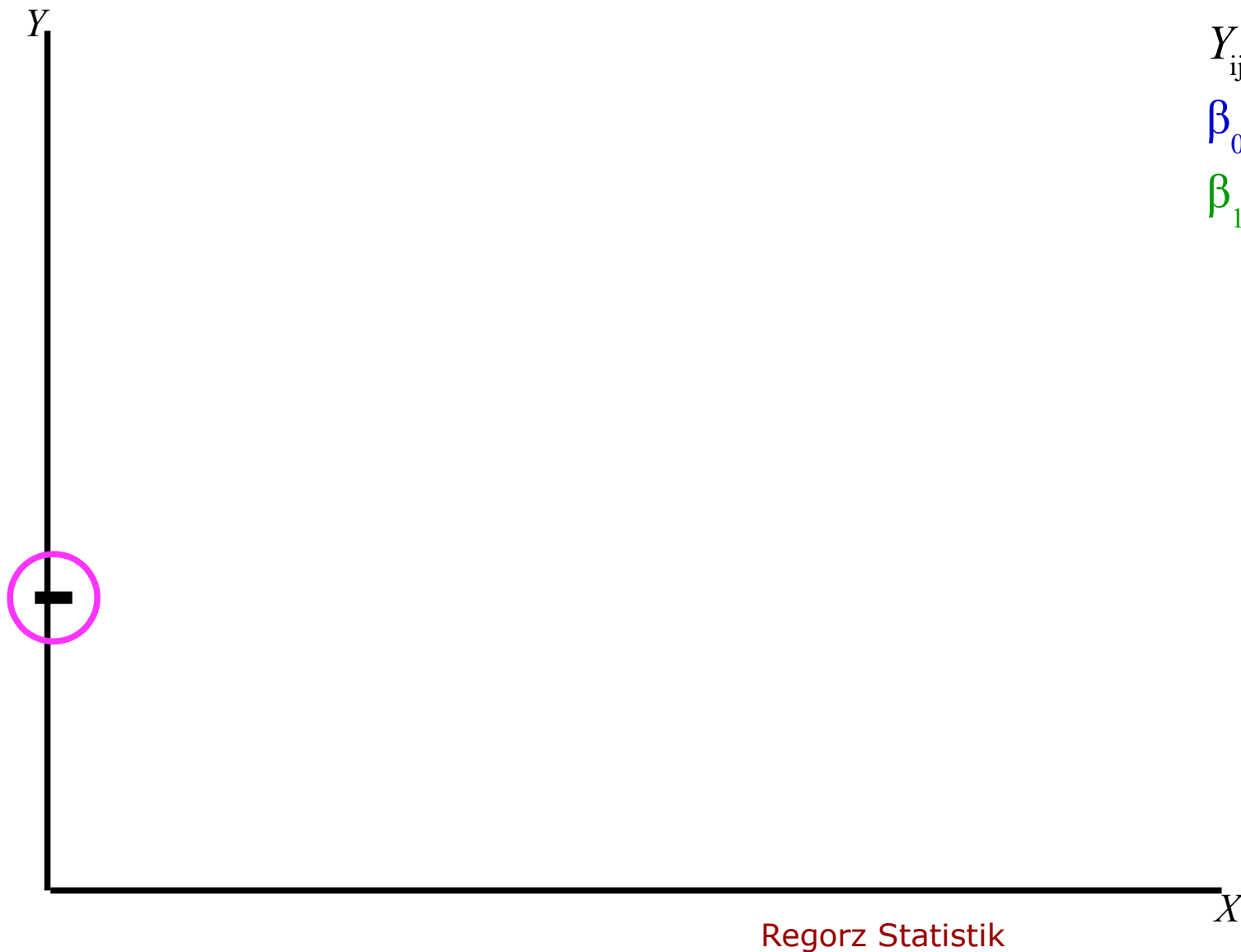
$$\beta_{0j} = \gamma_{00} + u_{0j} \quad (\text{L2})$$

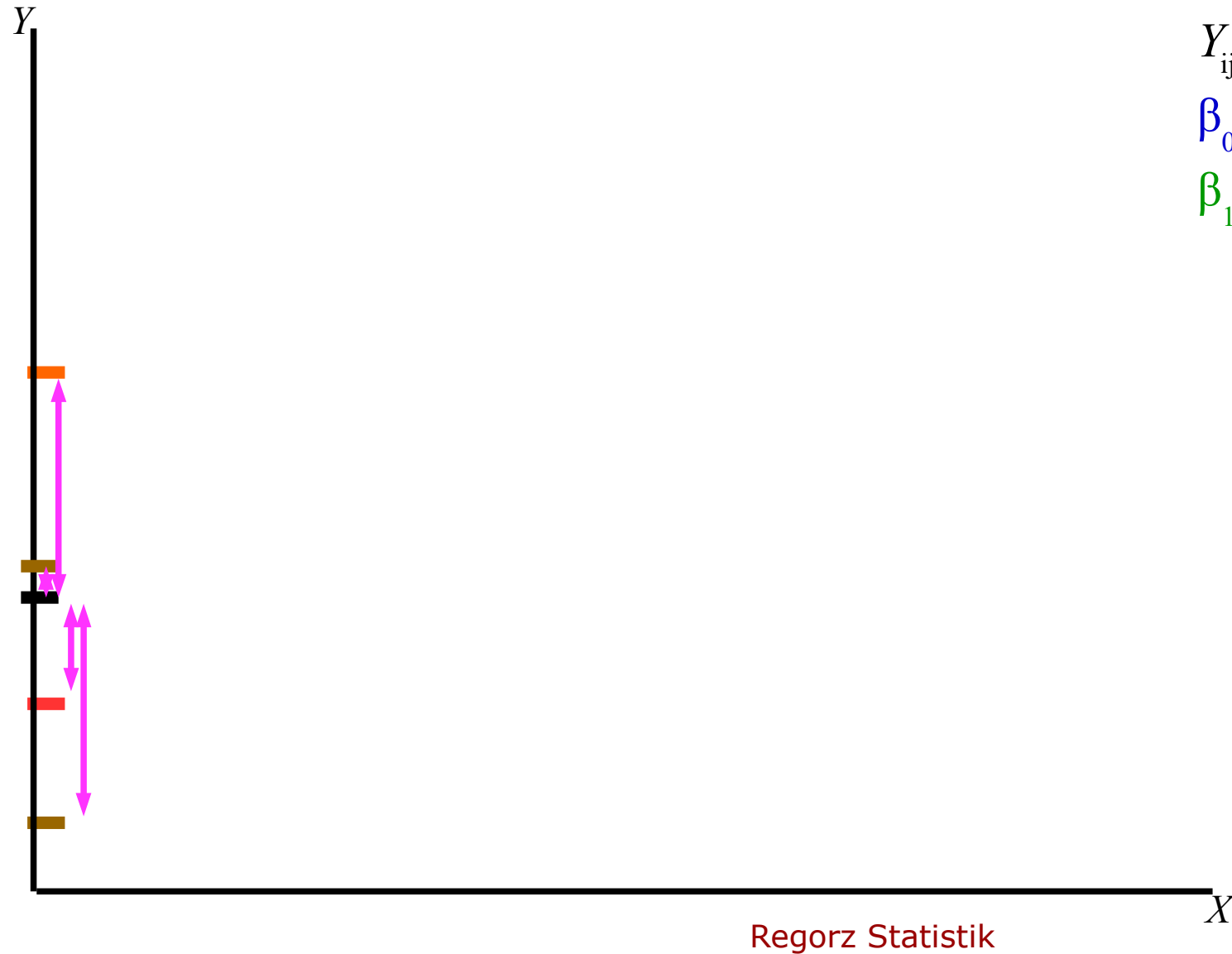
$$\beta_{1j} = \gamma_{10} + u_{1j} \quad (\text{L2})$$

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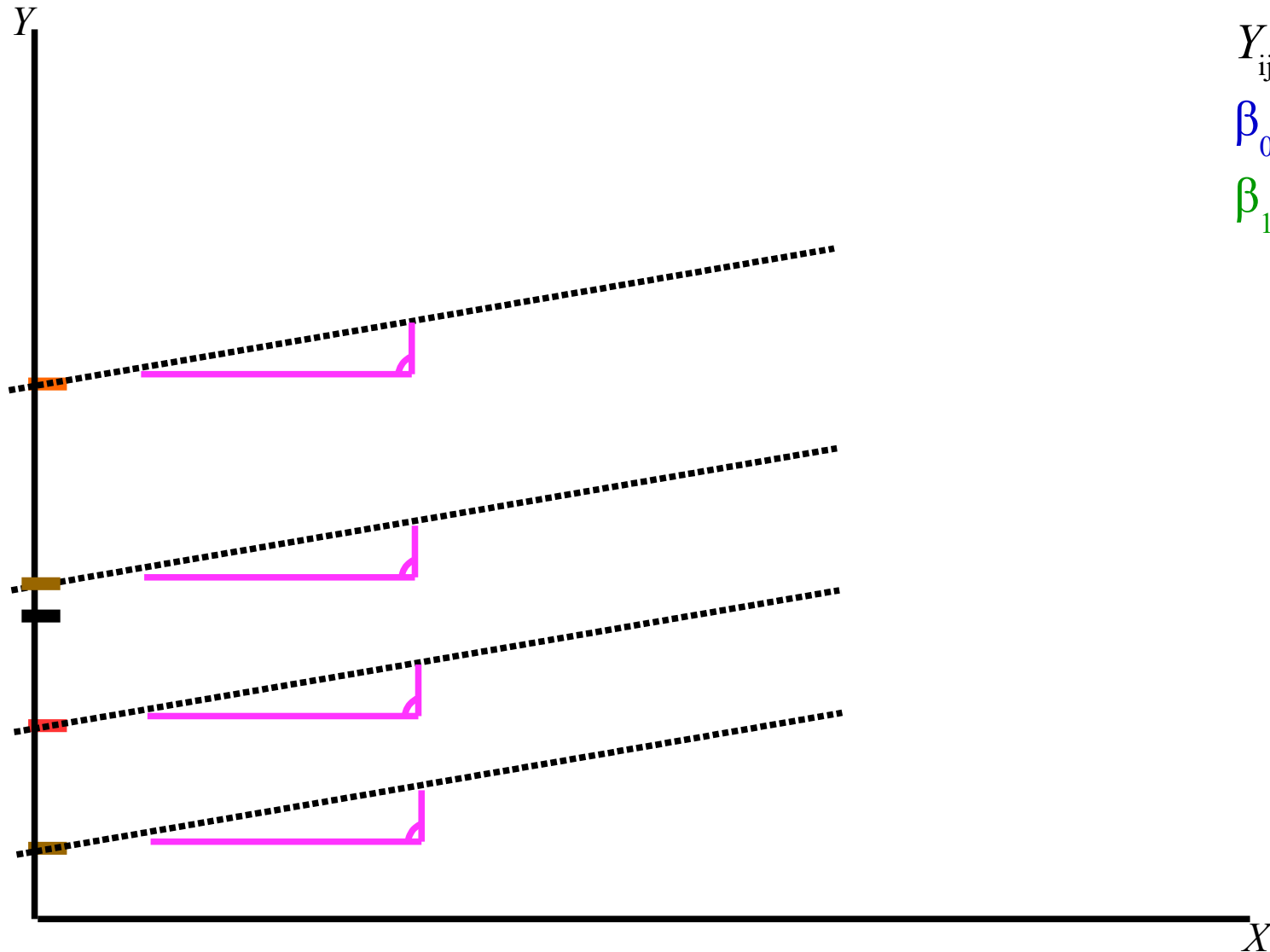




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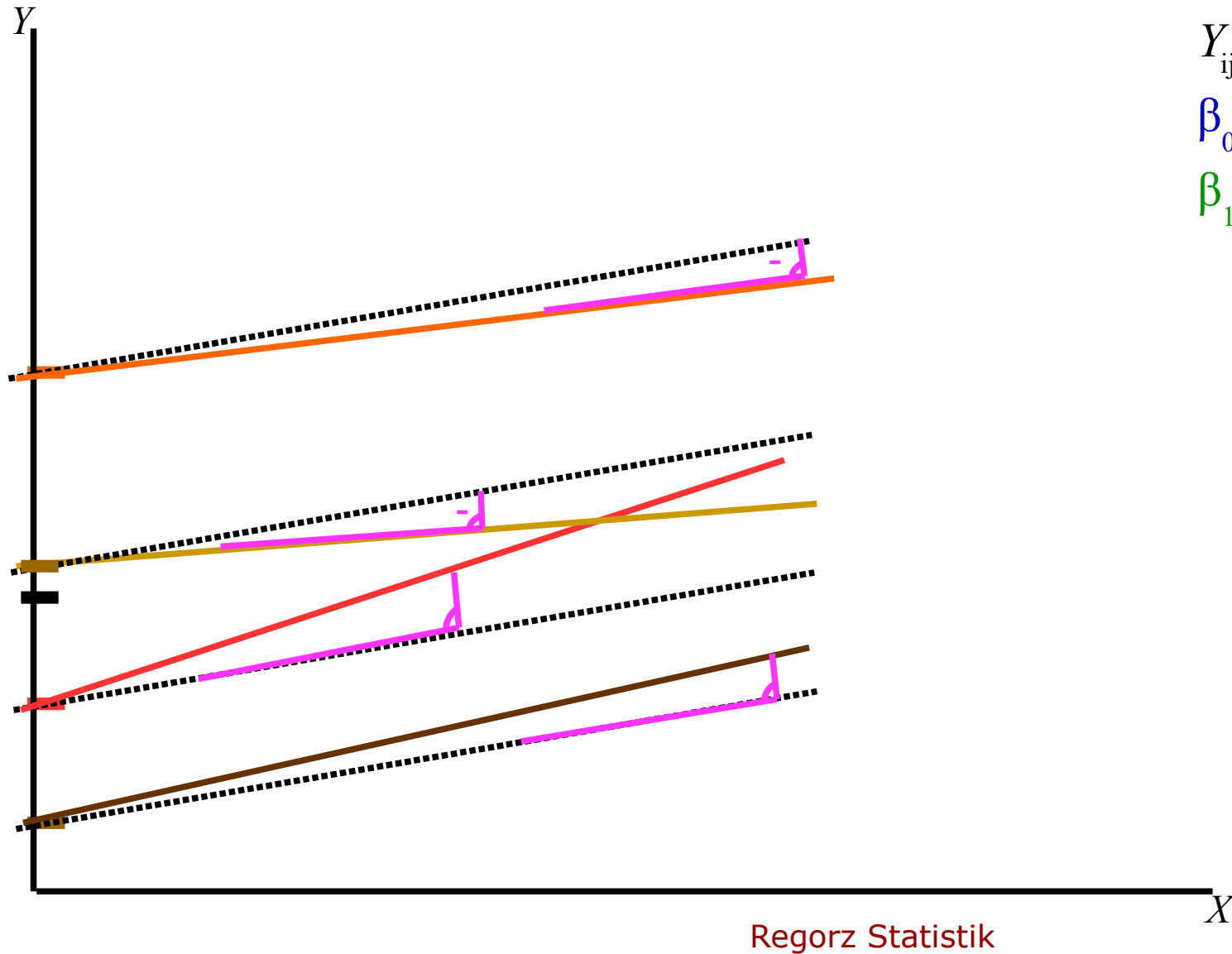


Regorz Statistik

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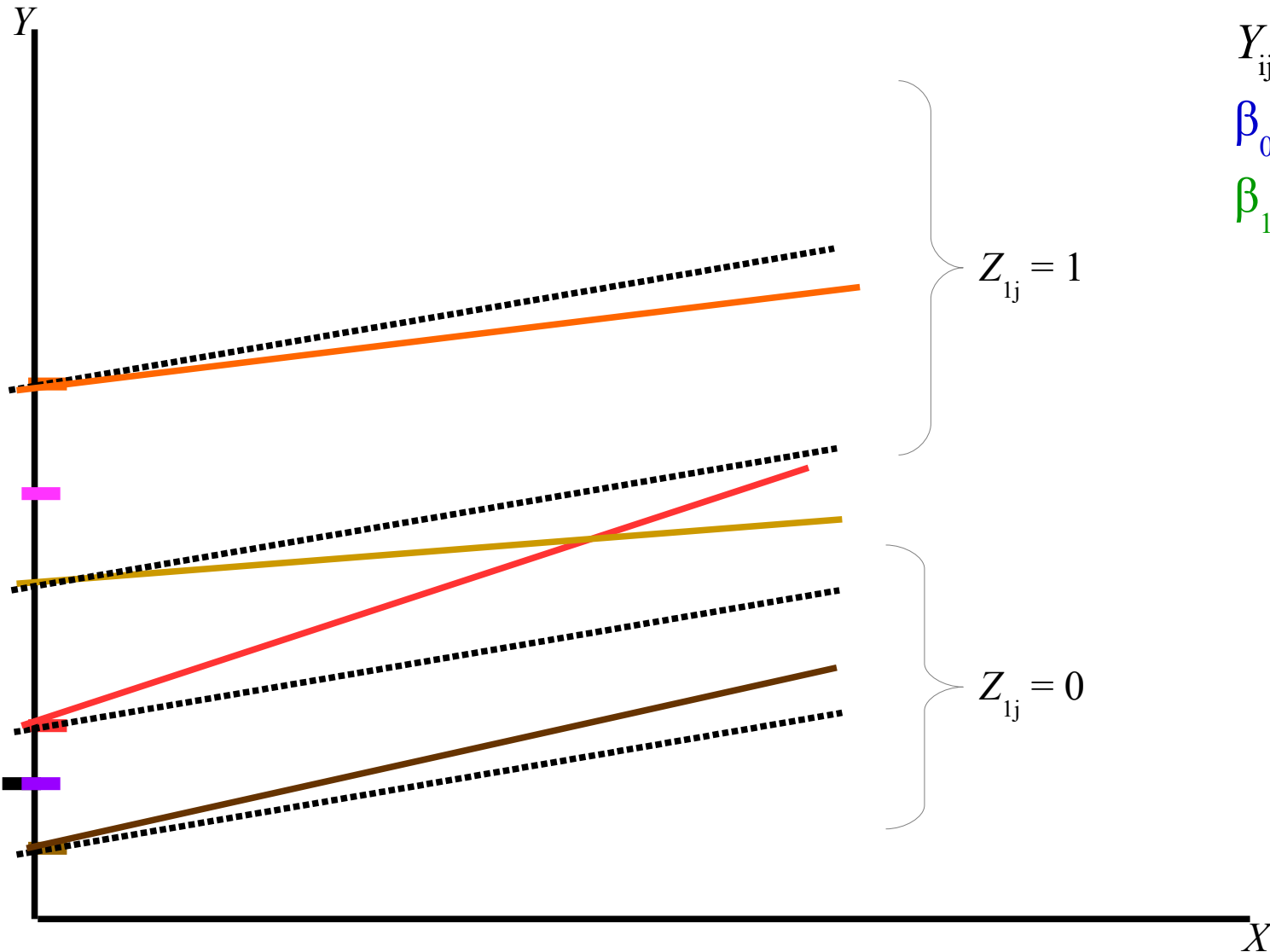


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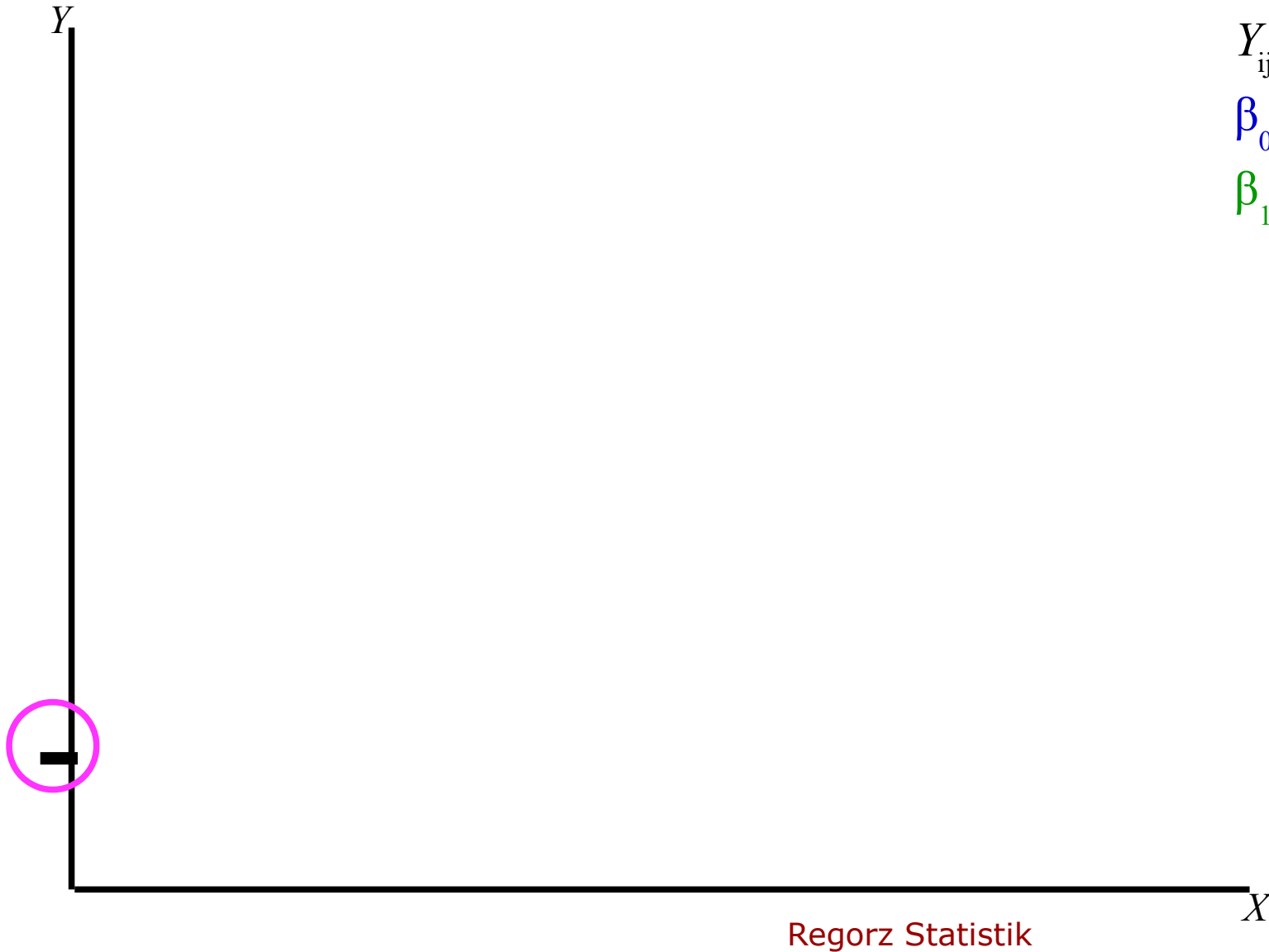
4. + Level 2 Prädiktor



$$Y_{ij} = \beta_{0j} + \beta_{1j} X_{1ij} + e_{ij} \quad (\text{L1})$$

$$\beta_{0j} = \gamma_{00} + \gamma_{01} Z_{1j} + u_{0j} \quad (\text{L2})$$

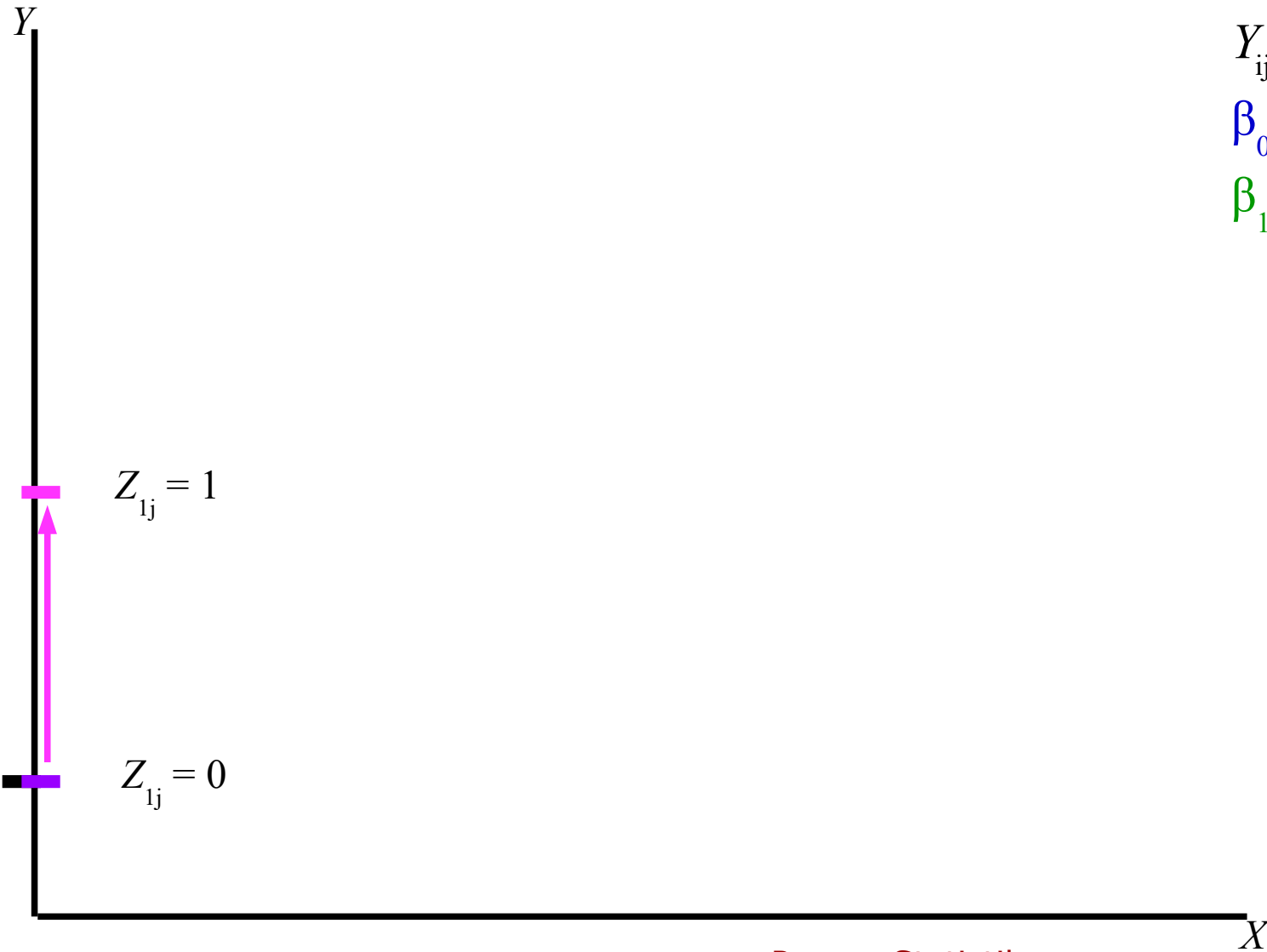
$$\beta_{1j} = \gamma_{10} + u_{1j} \quad (\text{L2})$$



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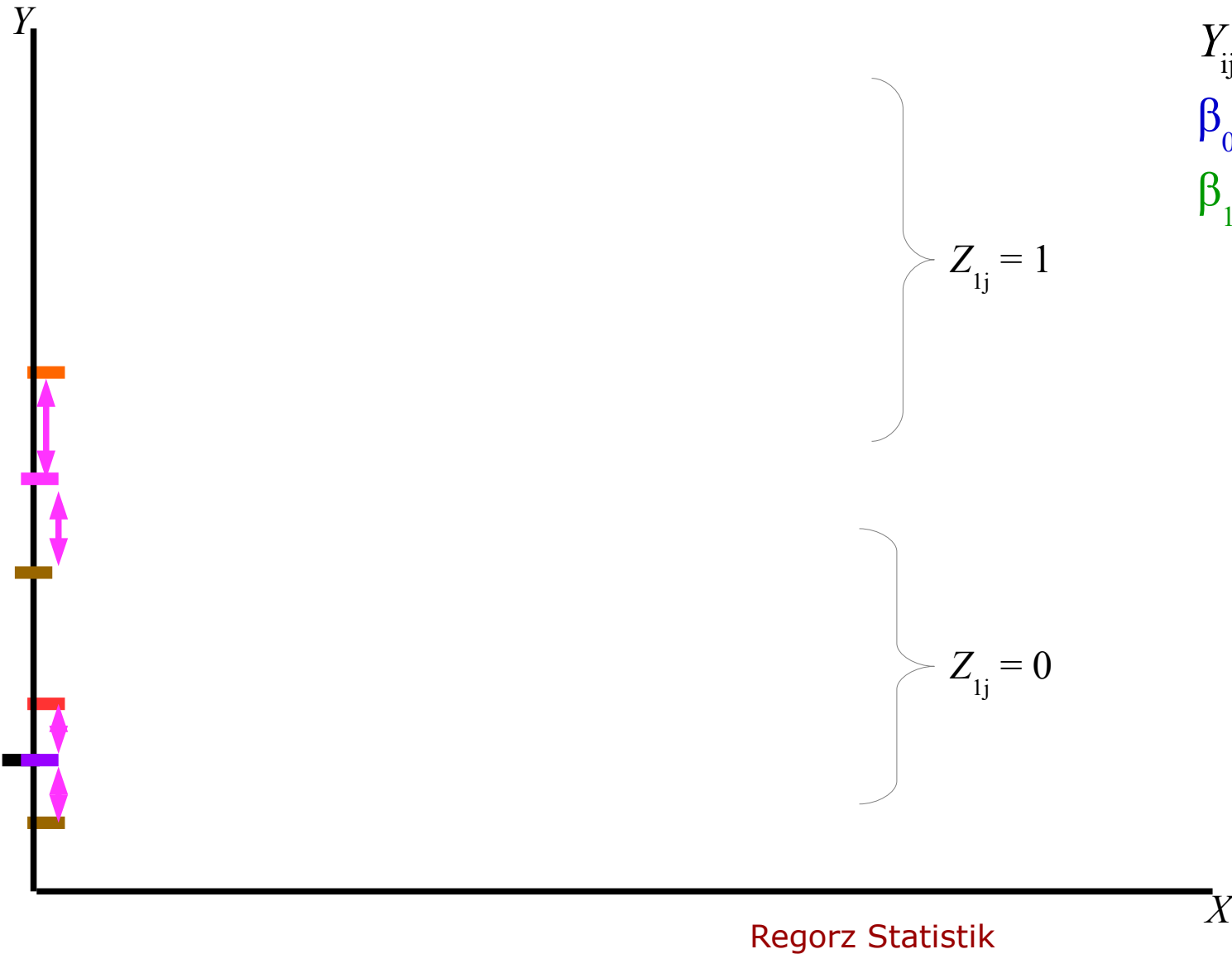
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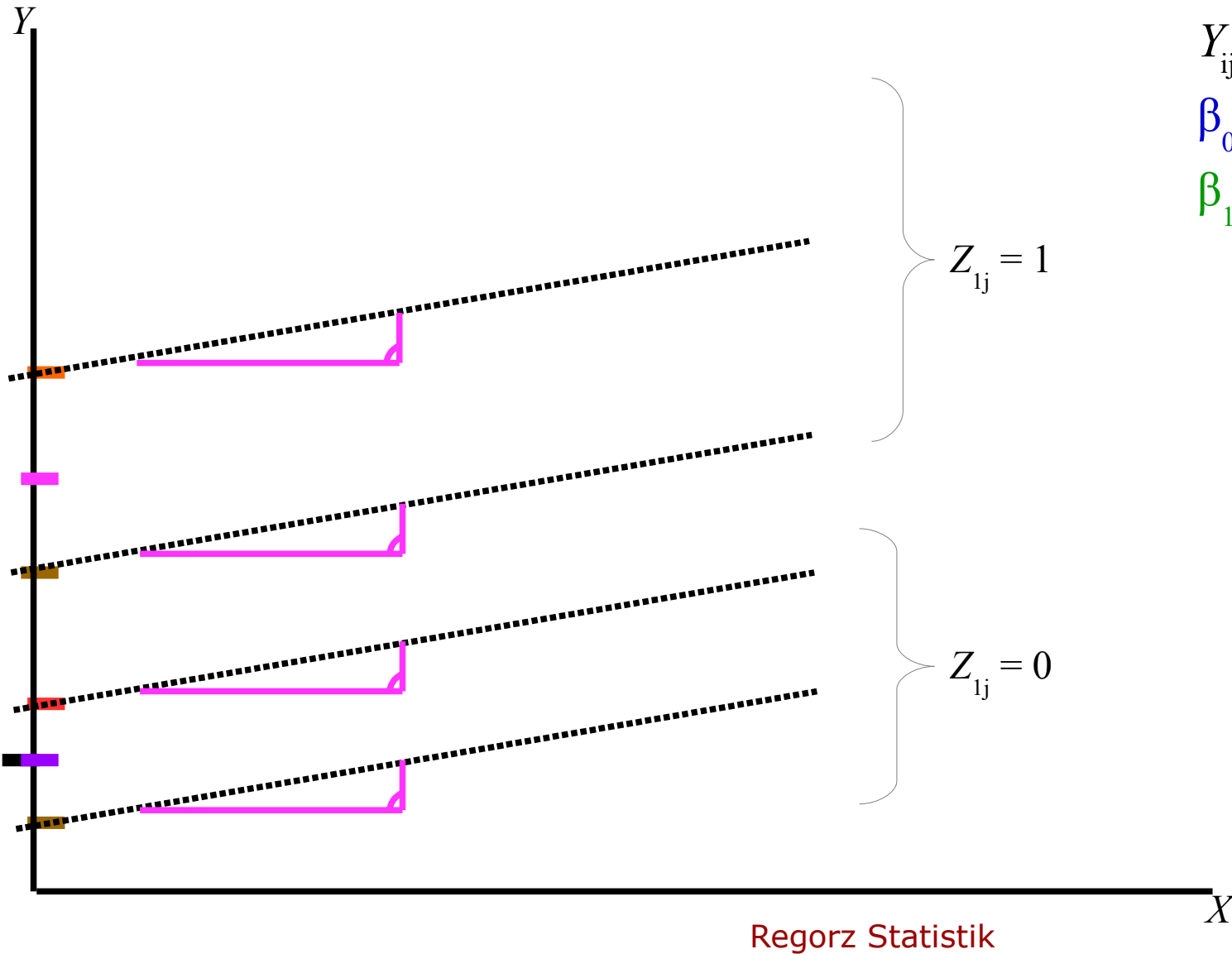
$$\beta_{1j} = \gamma_{10} + u_{1j} \quad (\text{L2})$$



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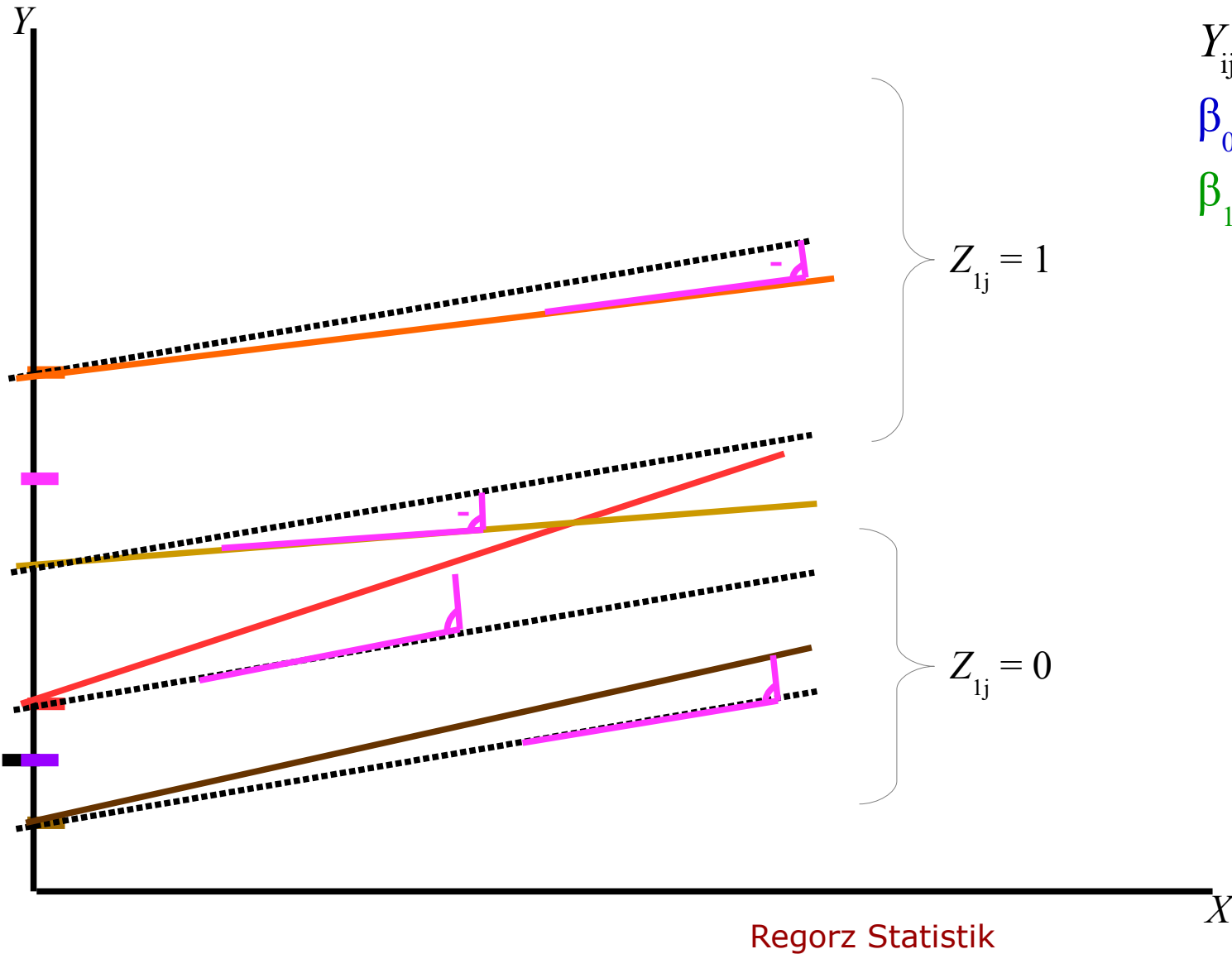
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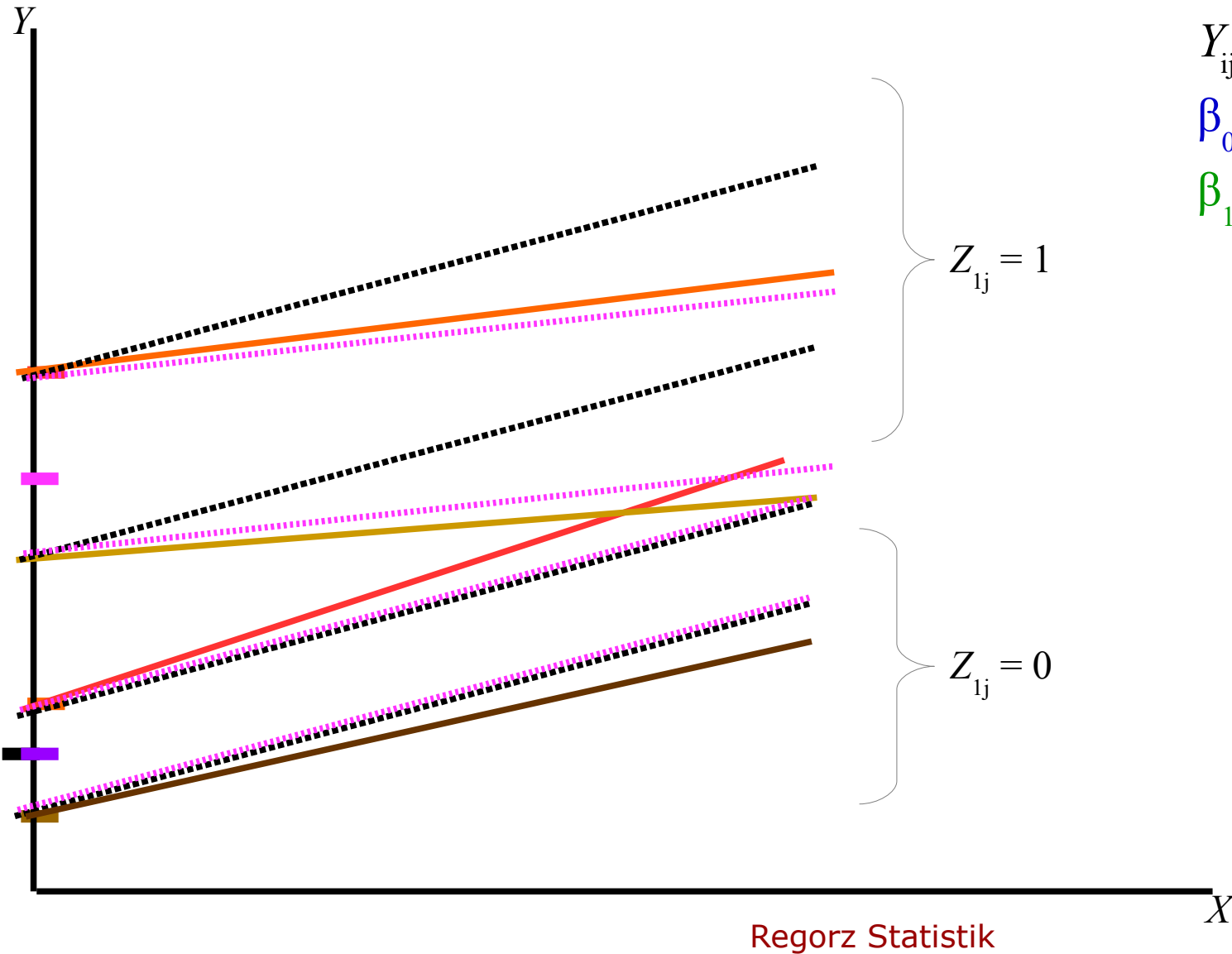


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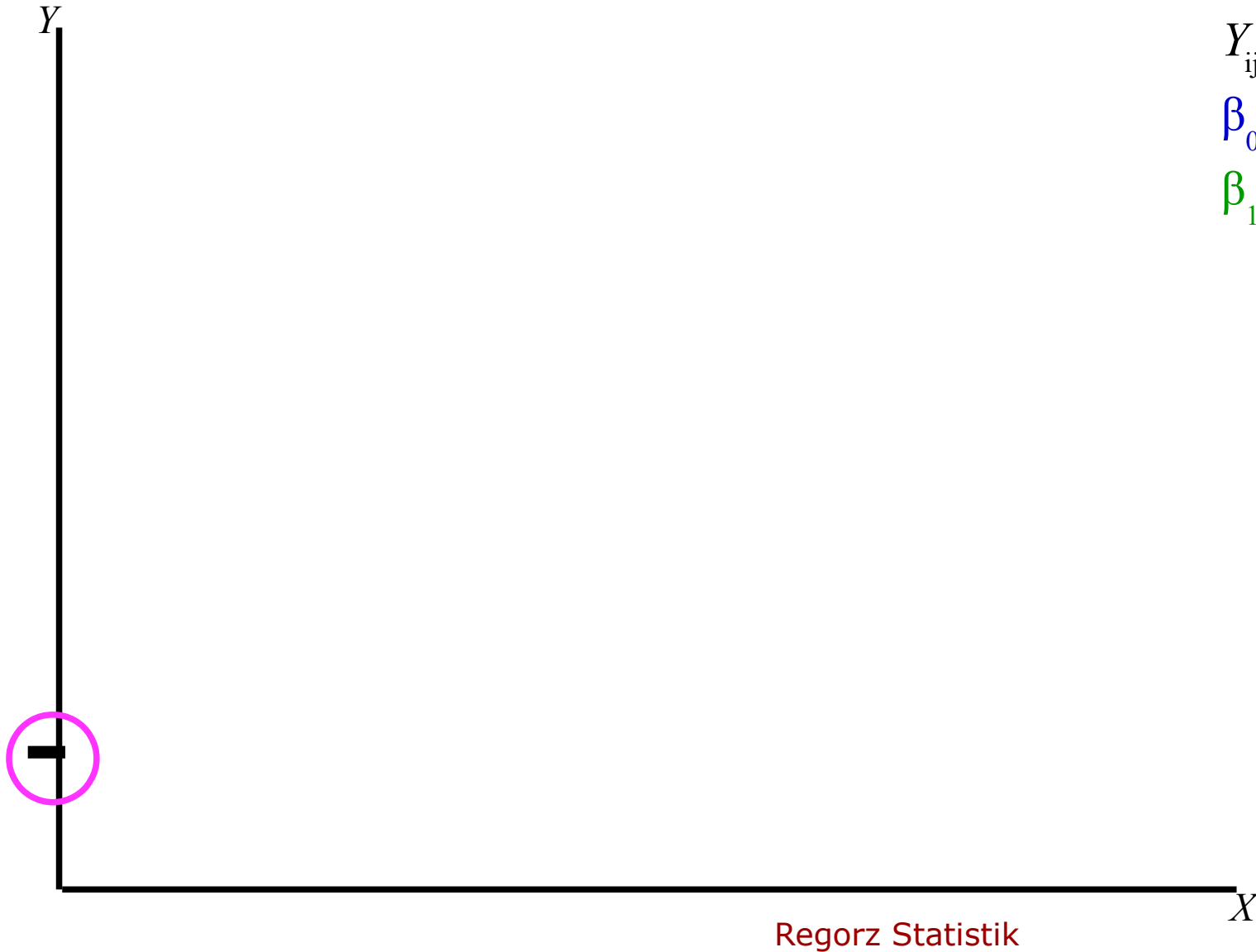
5. + Cross-Level-Interaction



$$Y_{ij} = \beta_{0j} + \beta_{1j} X_{1ij} + e_{ij} \quad (\text{L1})$$

$$\beta_{0j} = \gamma_{00} + \gamma_{01} Z_{1j} + u_{0j} \quad (\text{L2})$$

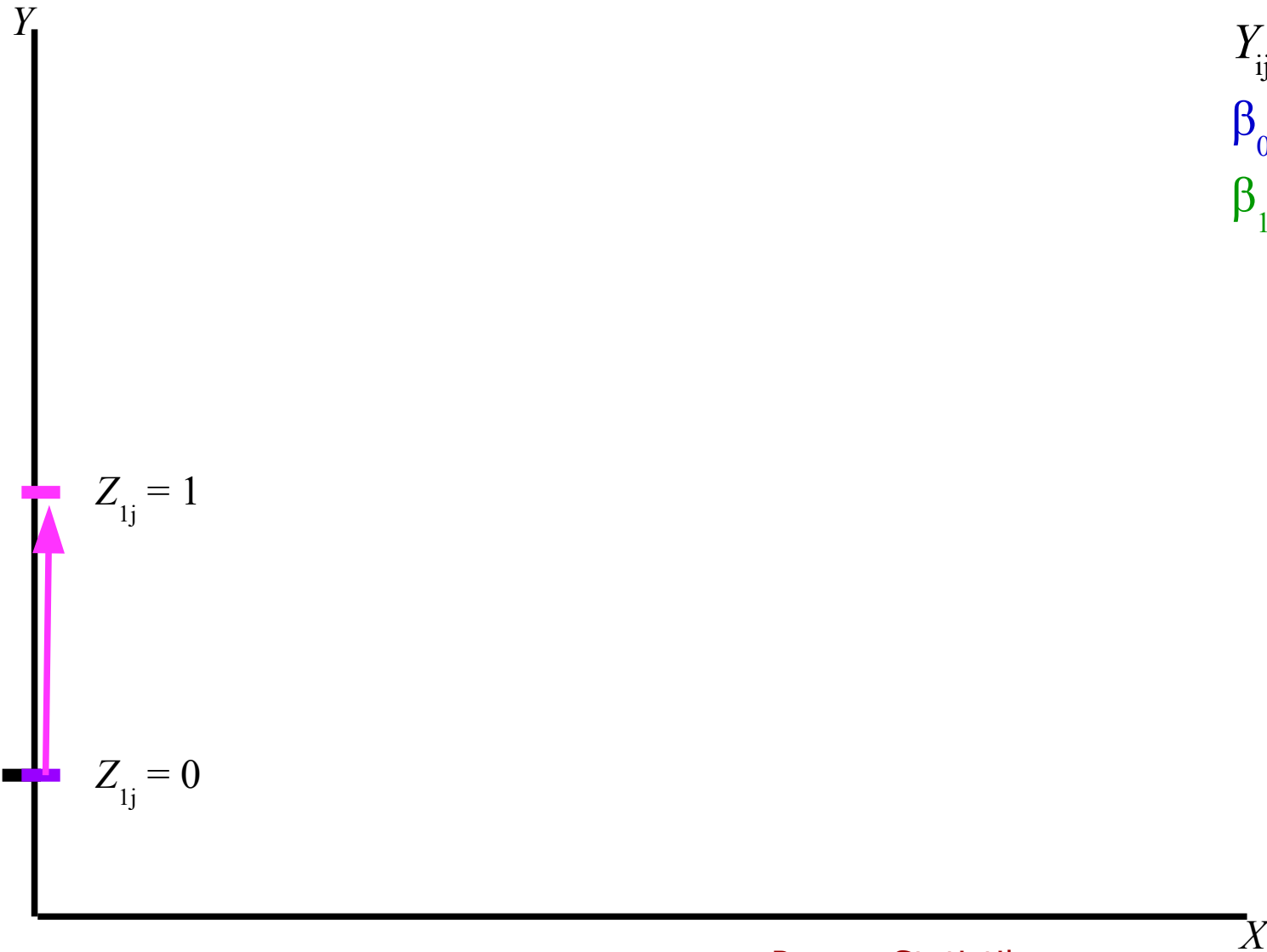
$$\beta_{1j} = \gamma_{10} + \gamma_{11} Z_{1j} + u_{1j} \quad (\text{L2})$$



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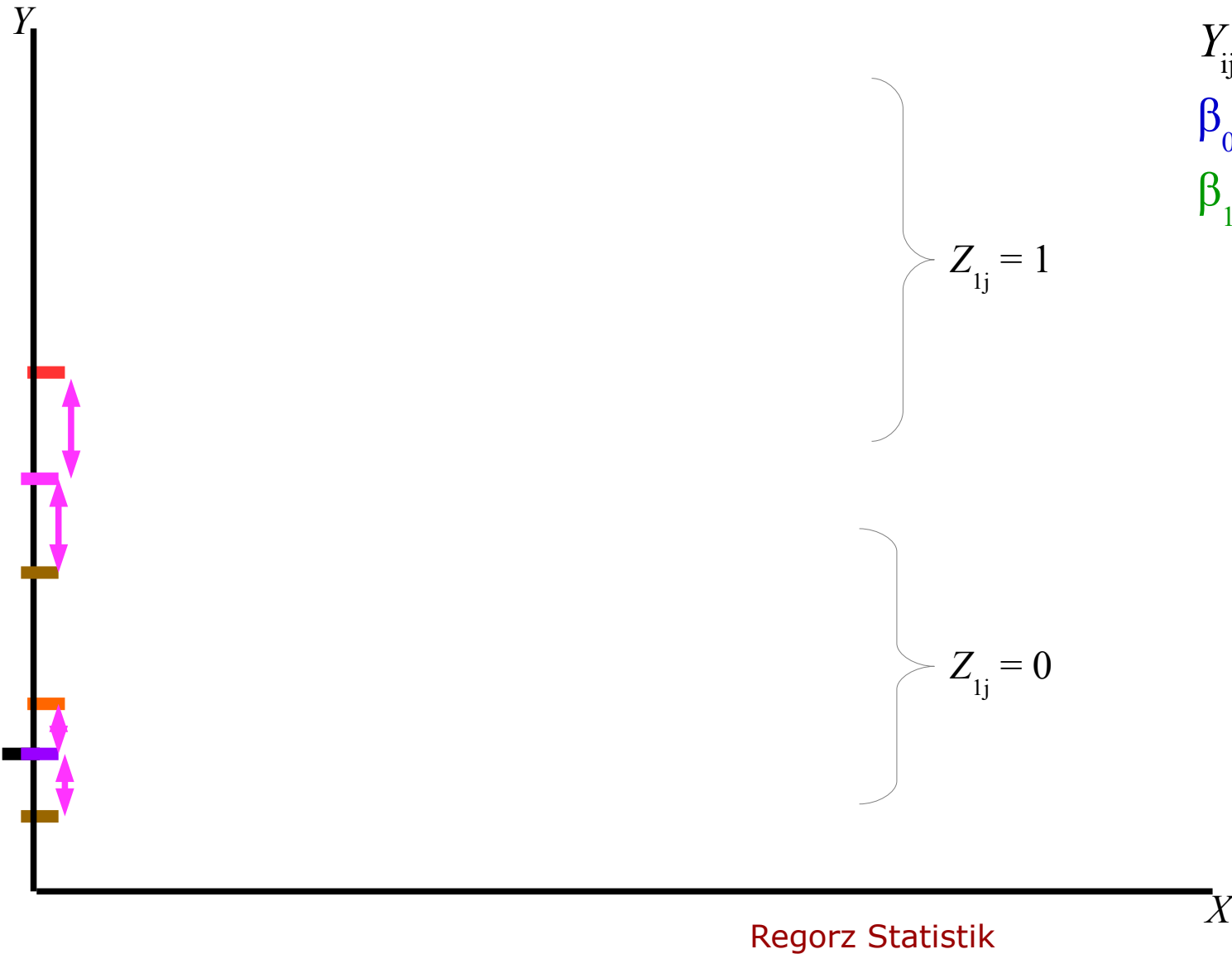
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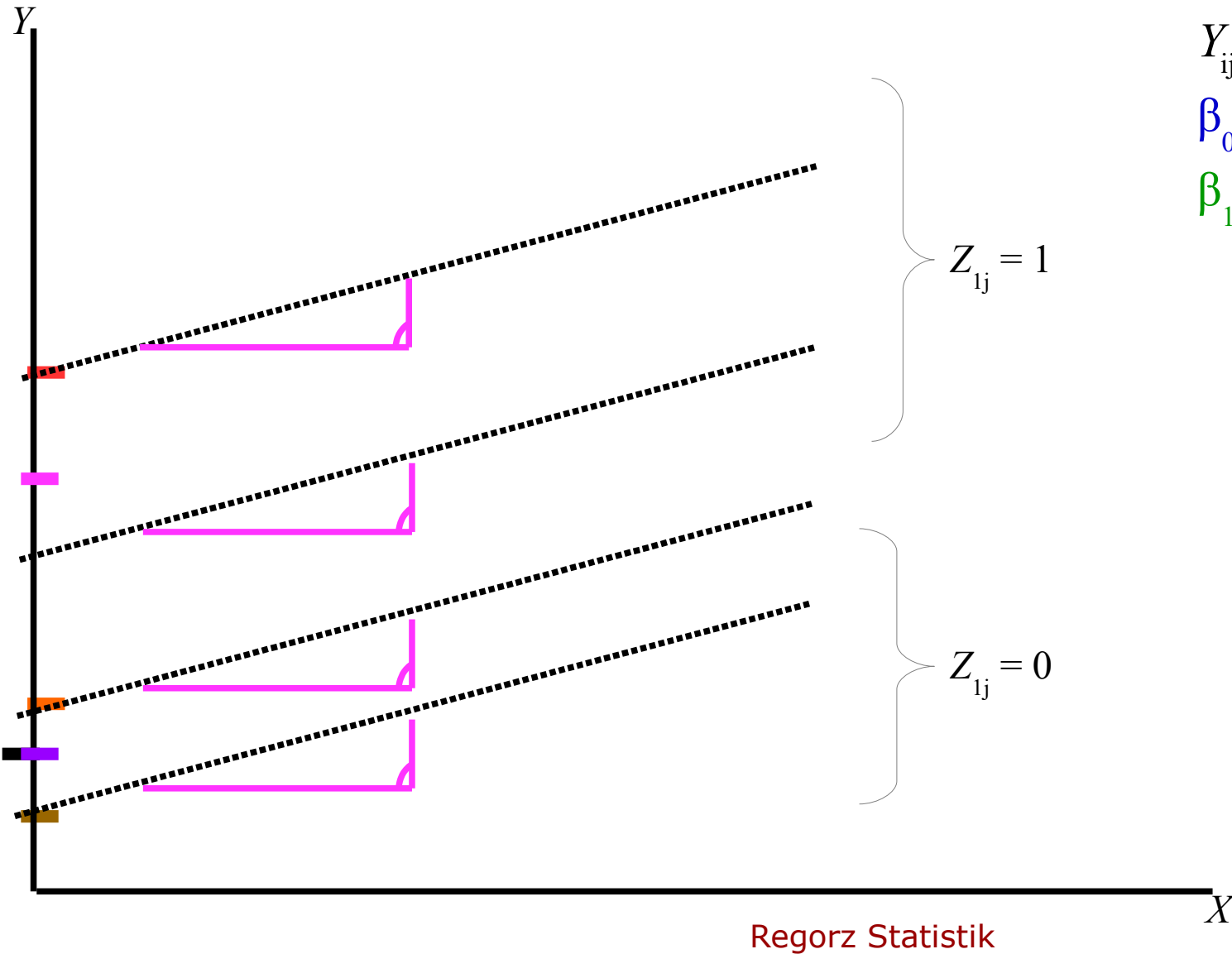
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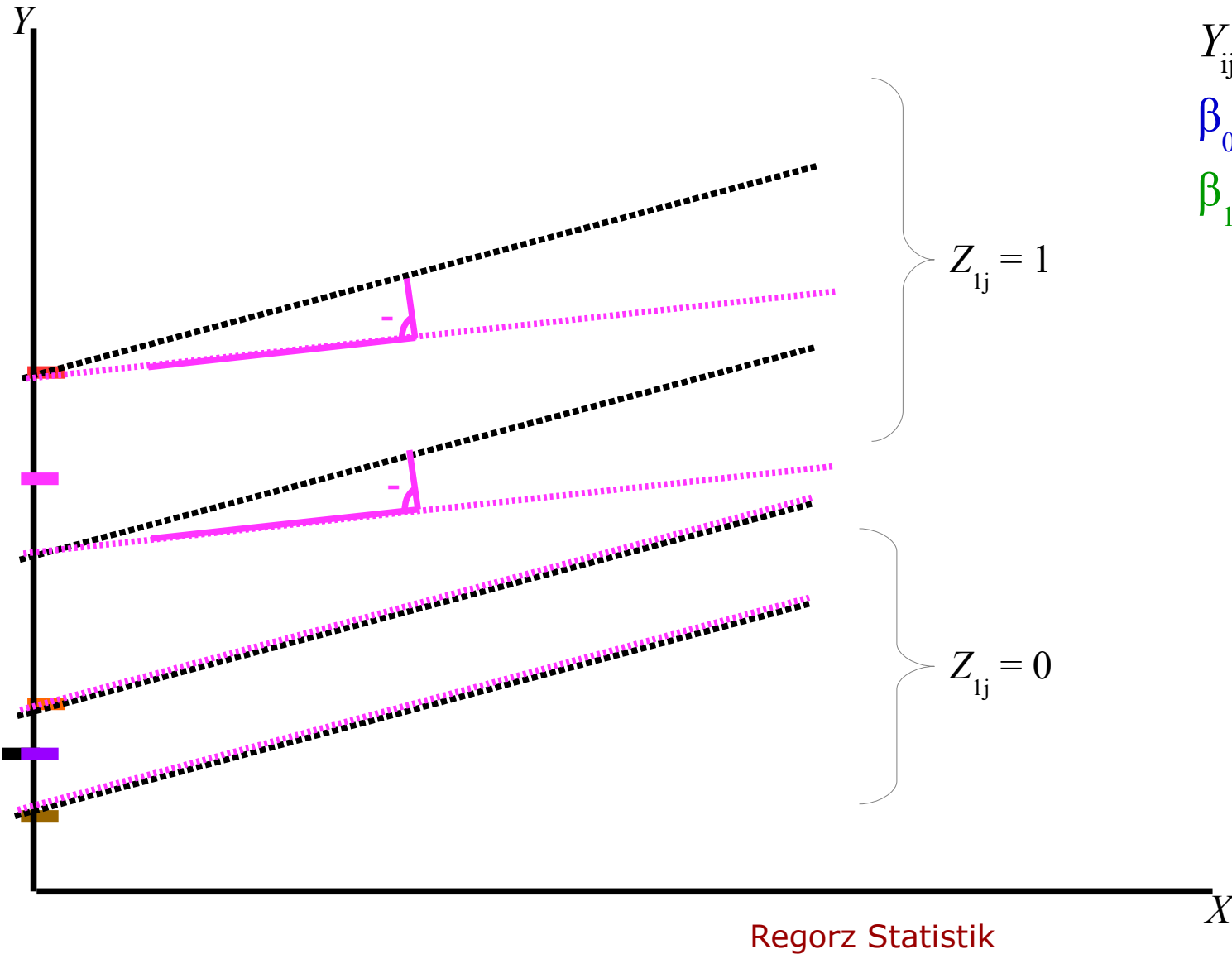
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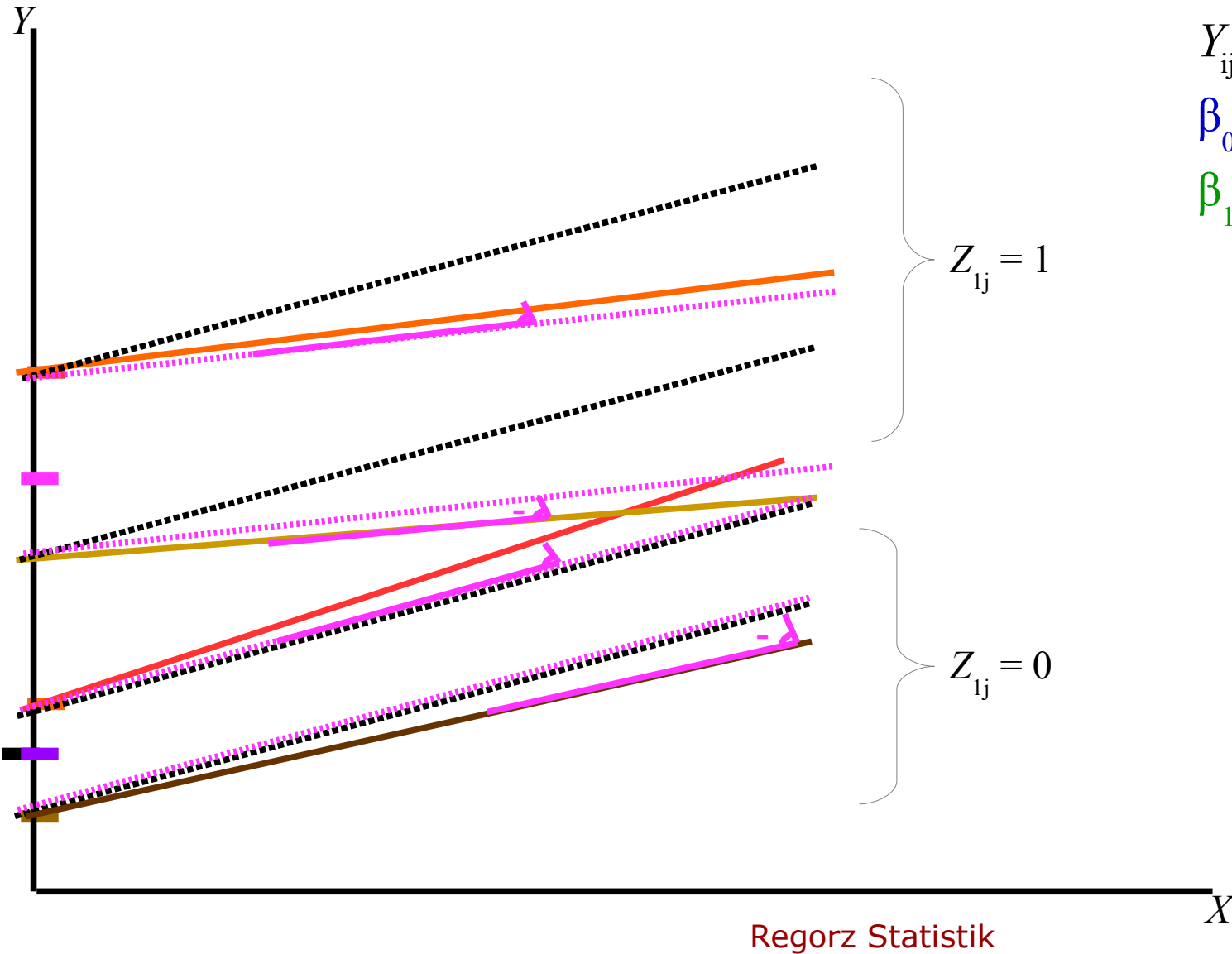
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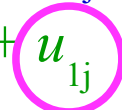
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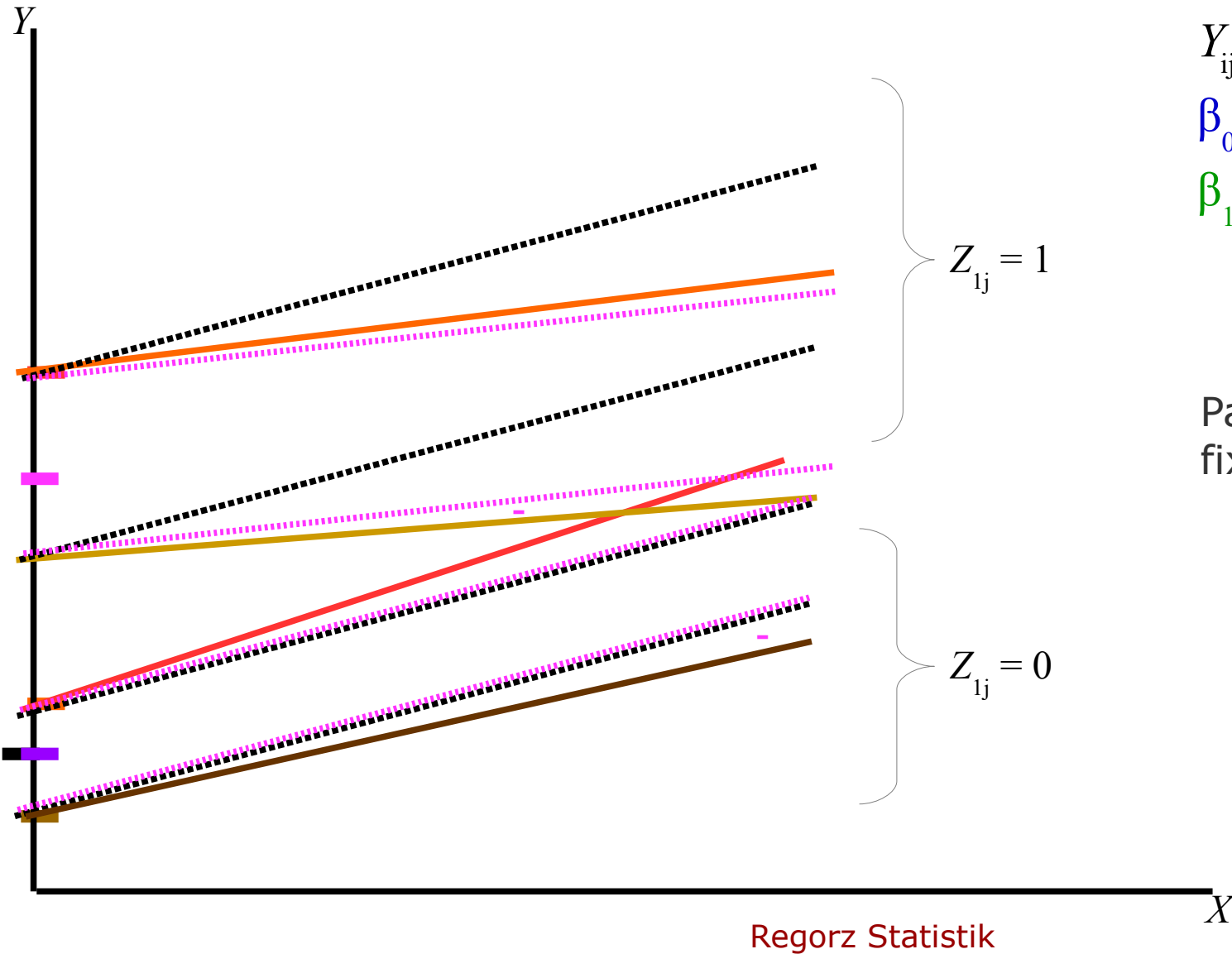


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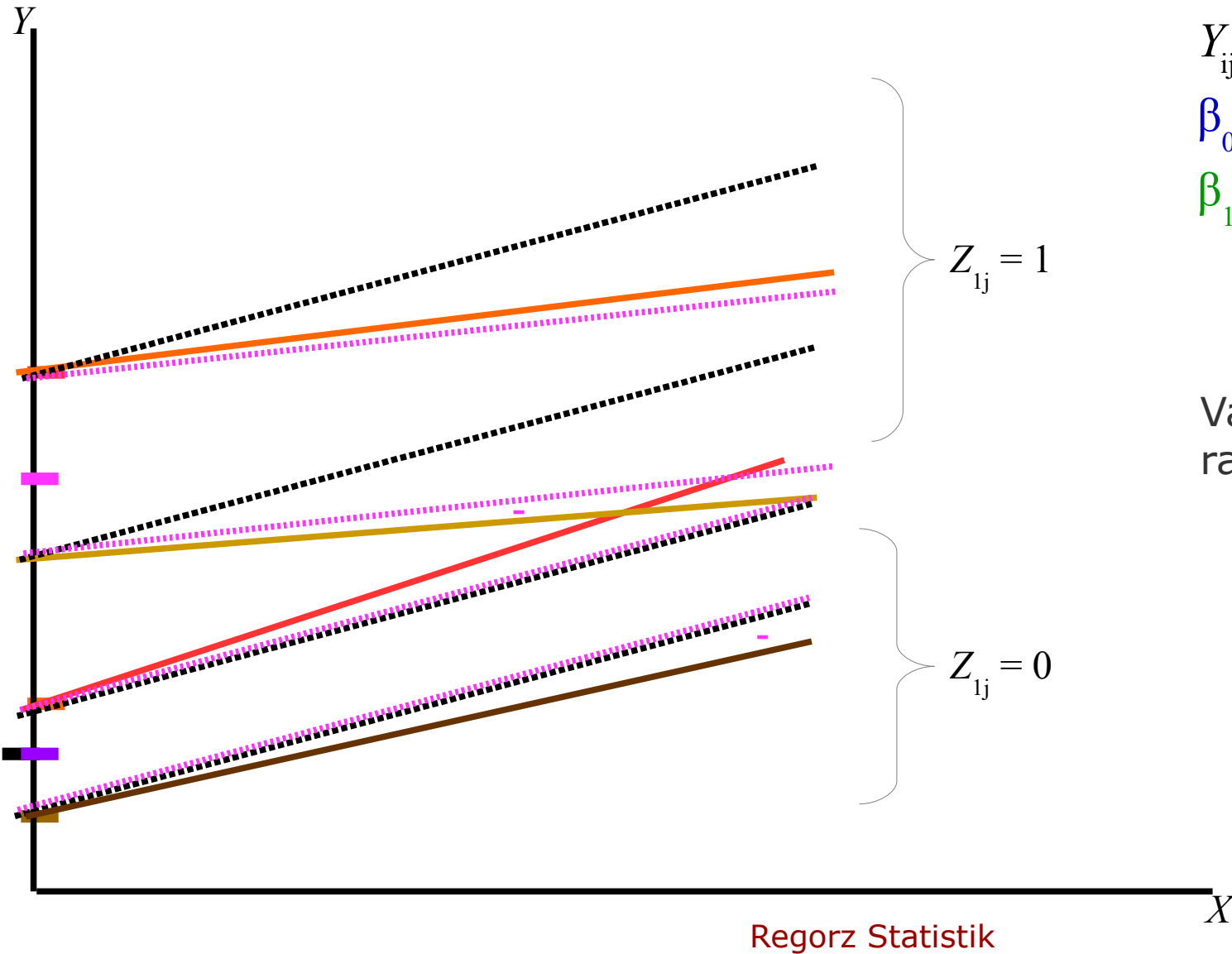


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Parameterschätzungen
fixed Effects

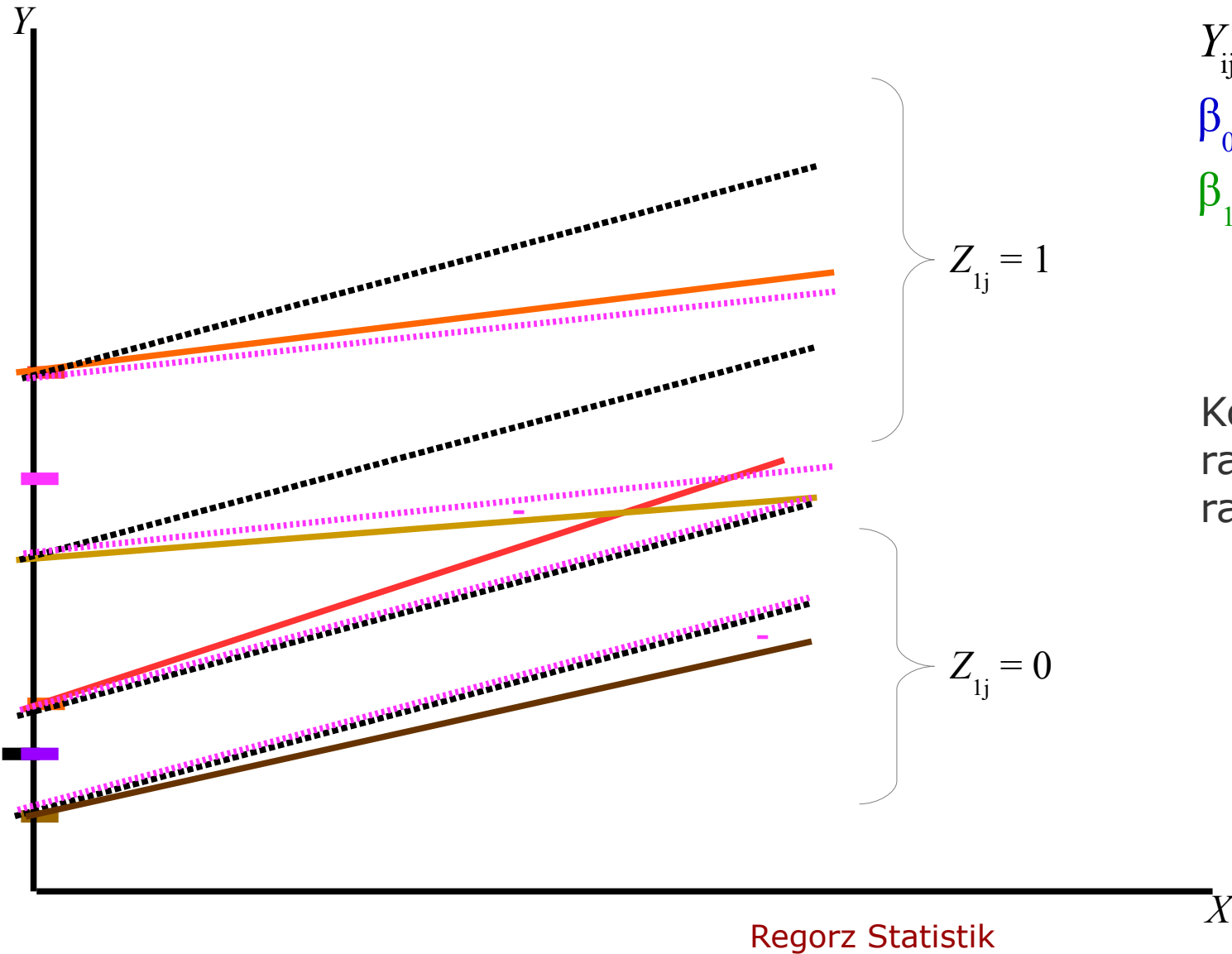


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Varianzschätzungen
random Effects



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Kovarianzschätzung
random intercept mit
random slope

Nötige Ergänzungen

- Stichprobengröße (insbes. L2)
- Regressionsvoraussetzungen
- Zentrierung wg. Interpretation

Hilfreich?



www.regorz-statistik.de

Regorz Statistik

Impressum:

Arndt Regorz

Alemannenstraße 6

44793 Bochum

mail@regorz-statistik.de

www.regorz-statistik.de

Regorz Statistik