

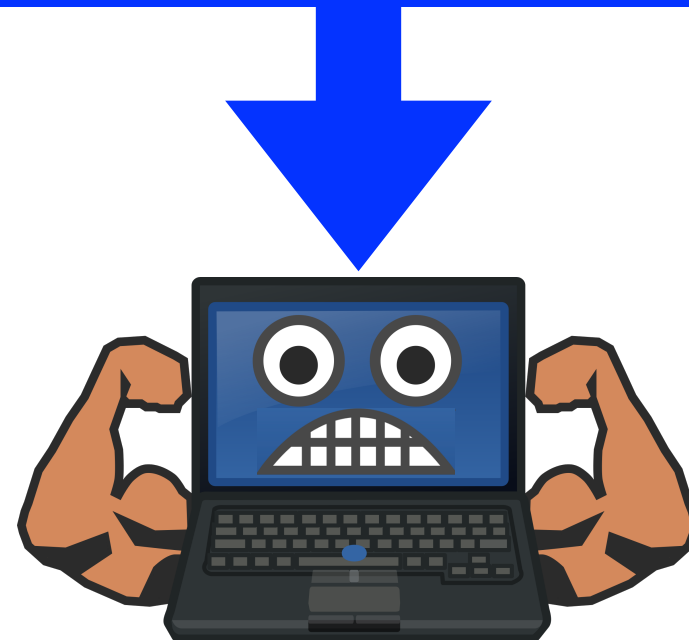
# Regularization

# Training Data

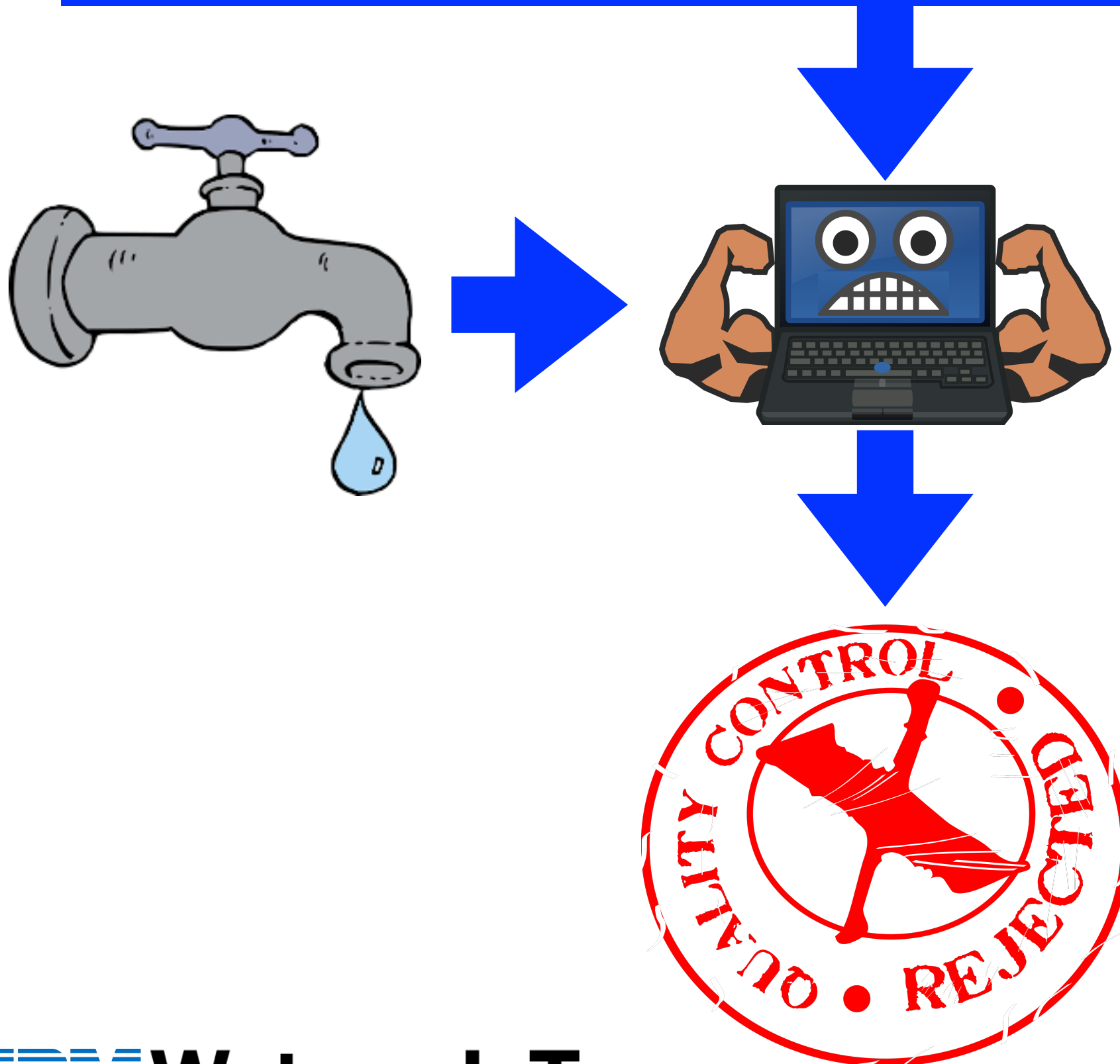
# Training Data



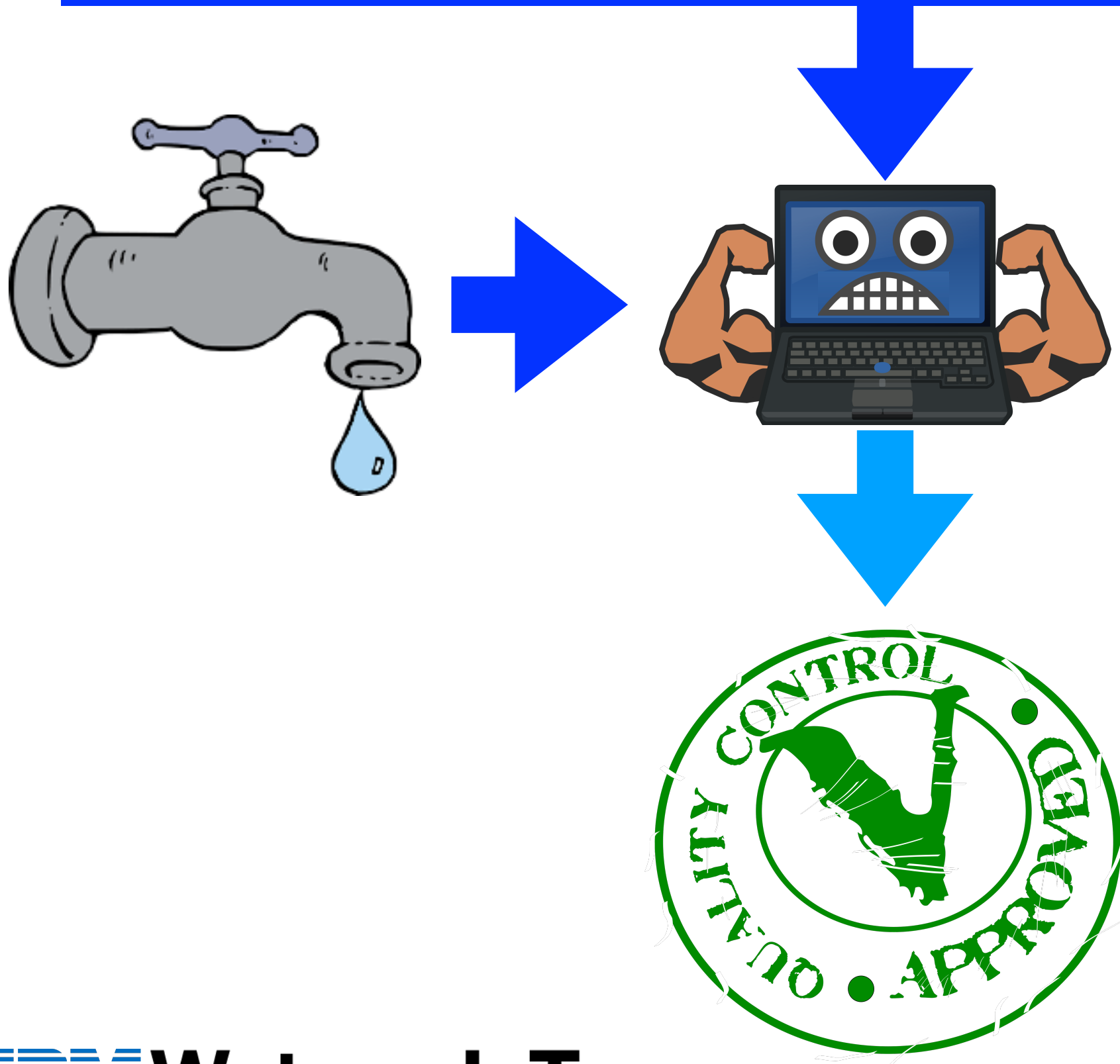
# Unseen Data



# Unseen Data



# Unseen Data



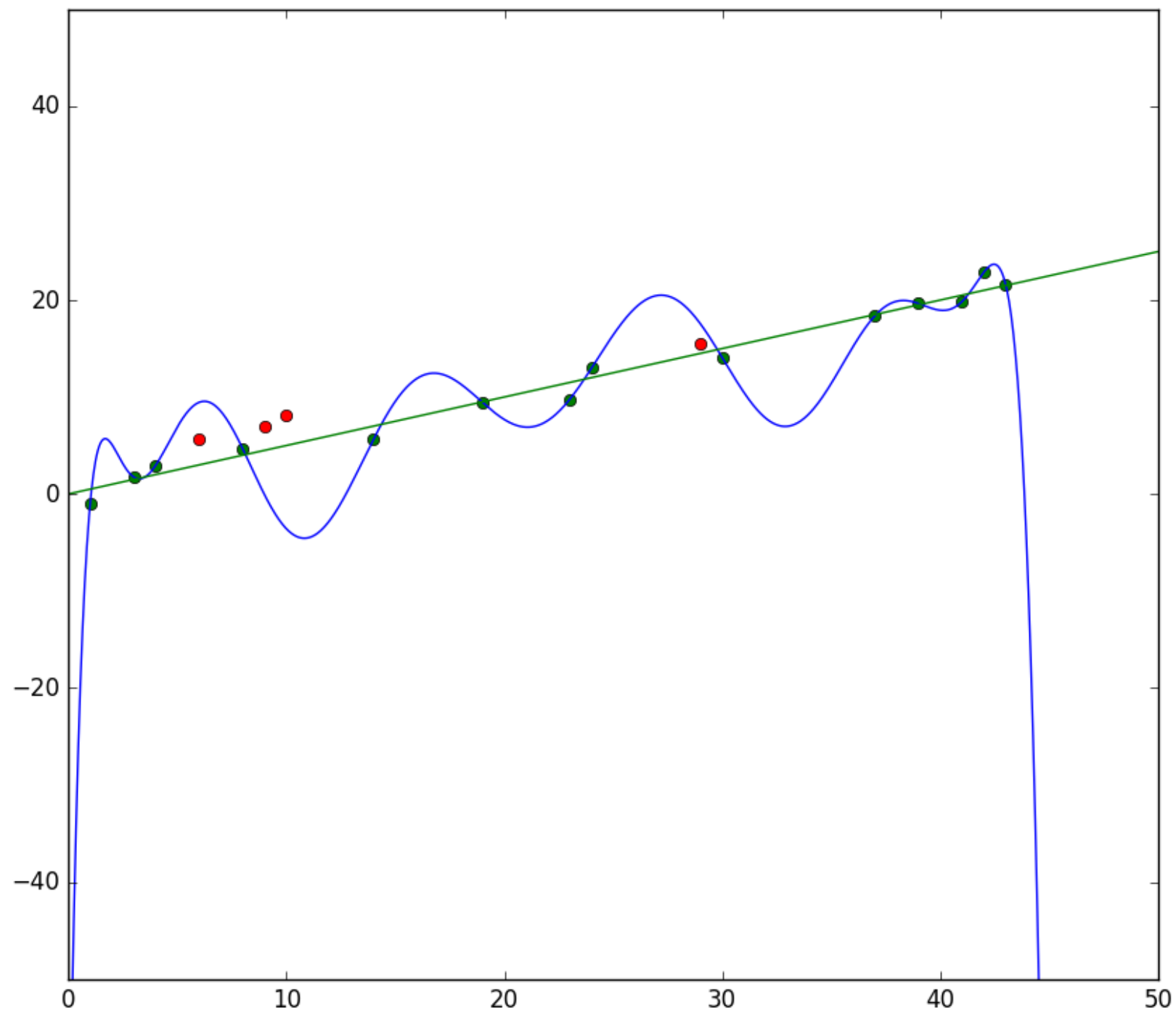
$$\sum_{i=1}^n (Y_i - \sum_{j=1}^p X_{ij} \beta_j)^2$$

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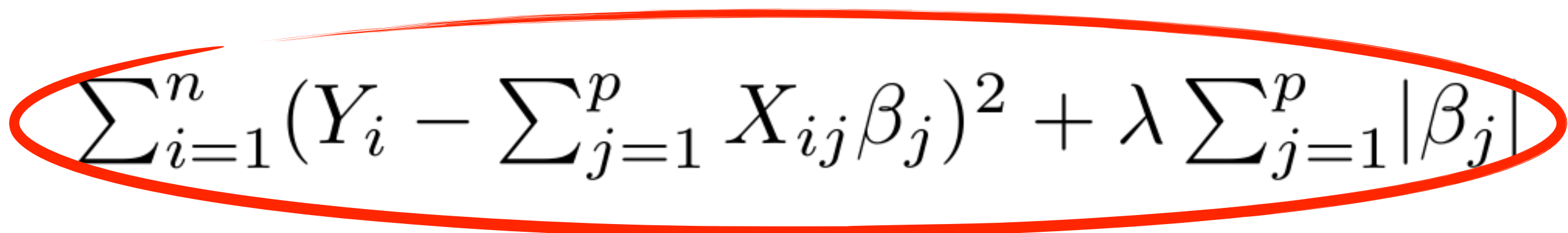
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$$\sum_{i=1}^n (Y_i - \sum_{j=1}^p X_{ij} \beta_j)^2 + \lambda \sum_{j=1}^p |\beta_j|$$

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# Summary