Building A Model (Step-By-Step)

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5 methods of building models:

- 1. All-in
- 2. Backward Elimination
- 3. Forward Selection
- 4. Bidirectional Elimination
- 5. Score Comparison

Stepwise Regression

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"All-in" - cases:

- Prior knowledge; OR
- You have to; OR
- Preparing for Backward Elimination



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Backward Elimination

STEP 1: Select a significance level to stay in the model (e.g. SL = 0.05)



STEP 2: Fit the full model with all possible predictors



STEP 3: Consider the predictor with the highest P-value. If P > SL, go to STEP 4, otherwise go to FIN



STEP 4: Remove the predictor



STEP 5: Fit model without this variable*



FIN: Your Model Is Ready

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Forward Selection

STEP 1: Select a significance level to enter the model (e.g. SL = 0.05)



STEP 2: Fit all simple regression models $\mathbf{y} \sim \mathbf{x_n}$ Select the one with the lowest P-value



STEP 3: Keep this variable and fit all possible models with one extra predictor added to the one(s) you already have



STEP 4: Consider the predictor with the lowest P-value. If P < SL, go to STEP 3, otherwise go to FIN



FIN: Keep the previous model

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Bidirectional Elimination

STEP 1: Select a significance level to enter and to stay in the model e.g.: SLENTER = 0.05, SLSTAY = 0.05





STEP 2: Perform the next step of Forward Selection (new variables must have: P < SLENTER to enter)



STEP 3: Perform ALL steps of Backward Elimination (old variables must have P < SLSTAY to stay)



STEP 4: No new variables can enter and no old variables can exit



FIN: Your Model Is Ready

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All Possible Models

STEP 1: Select a criterion of goodness of fit (e.g. Akaike criterion)



STEP 2: Construct All Possible Regression Models: 2N-1 total combinations



STEP 3: Select the one with the best criterion



FIN: Your Model Is Ready



Example: 10 columns means 1,023 models

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