## Modeling: Start to Finish

Example. Vehicular Stopping Distance
Background: In driver's training, you learn a rule for how far behind other cars you are supposed to stay.
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## Formulation.

State the question. Identify factors. Describe mathematically. Culminates with a mathematical model.

Mathematical Manipulation.
Determine mathematical conclusions.

## Evaluation.

Translate into real-world conclusions.
How good is the model?

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First, we need to state the question (or questions) clearly and precisely.
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Stopping distance is a function of what?
$v$ velocity
$t_{r}$ reaction time
a vehicle acceleration / deceleration

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Describe mathematically.

Subproblem 1:
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This energy absorbs the kinetic energy of the car, $\frac{1}{2} m v$.
Solving $m \cdot a \cdot d_{b}=\frac{1}{2} m v^{2}$, we expect

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Therefore, the total stopping distance is $d_{r}+d_{b}=t_{r} v+C v^{2}$.

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- Examine methodology of data collection.
- Experimenters said $t_{r}=3 / 4 \mathrm{sec}$ and calculated $d_{r}$ !
- Perhaps we should design our own trial?


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Check fit: Plots observed stopping distance versus model. (Fig. 3.16)

- Model seems reasonable (through 70 mph ).
- Residual plot shows additional behavior unmodeled (Fig. 3.17)


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- This line of reasoning can be applied to any situation with constant deceleration.
- Come up with a good rule of thumb for drivers to follow and publicize it. (Next slide!)


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- four seconds enough ( $\leq 75 \mathrm{mph}$ )
- Add more if non-ideal road conditions.

