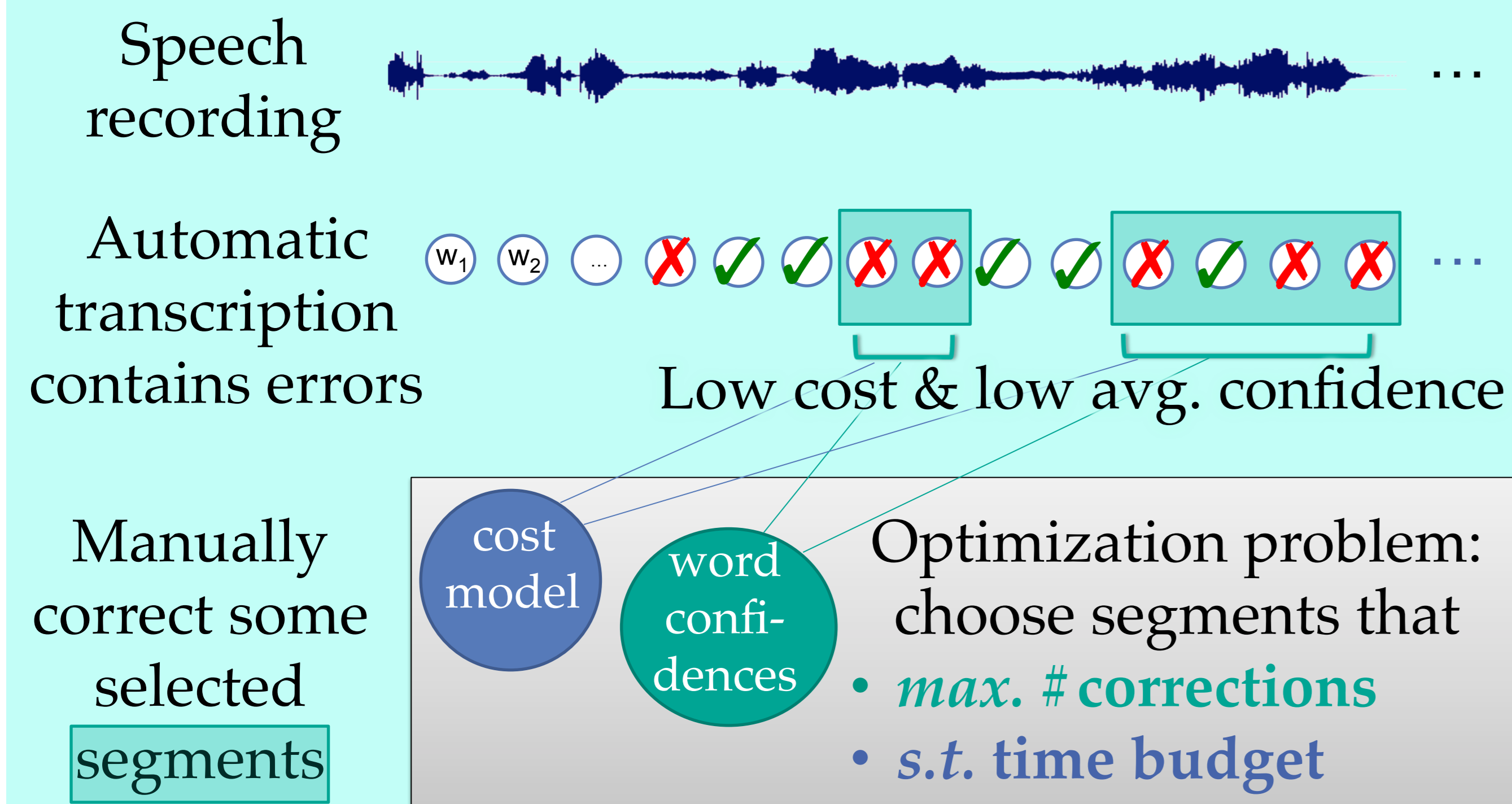


# On-the-fly User Modeling for Cost-sensitive Correction of Speech Transcripts

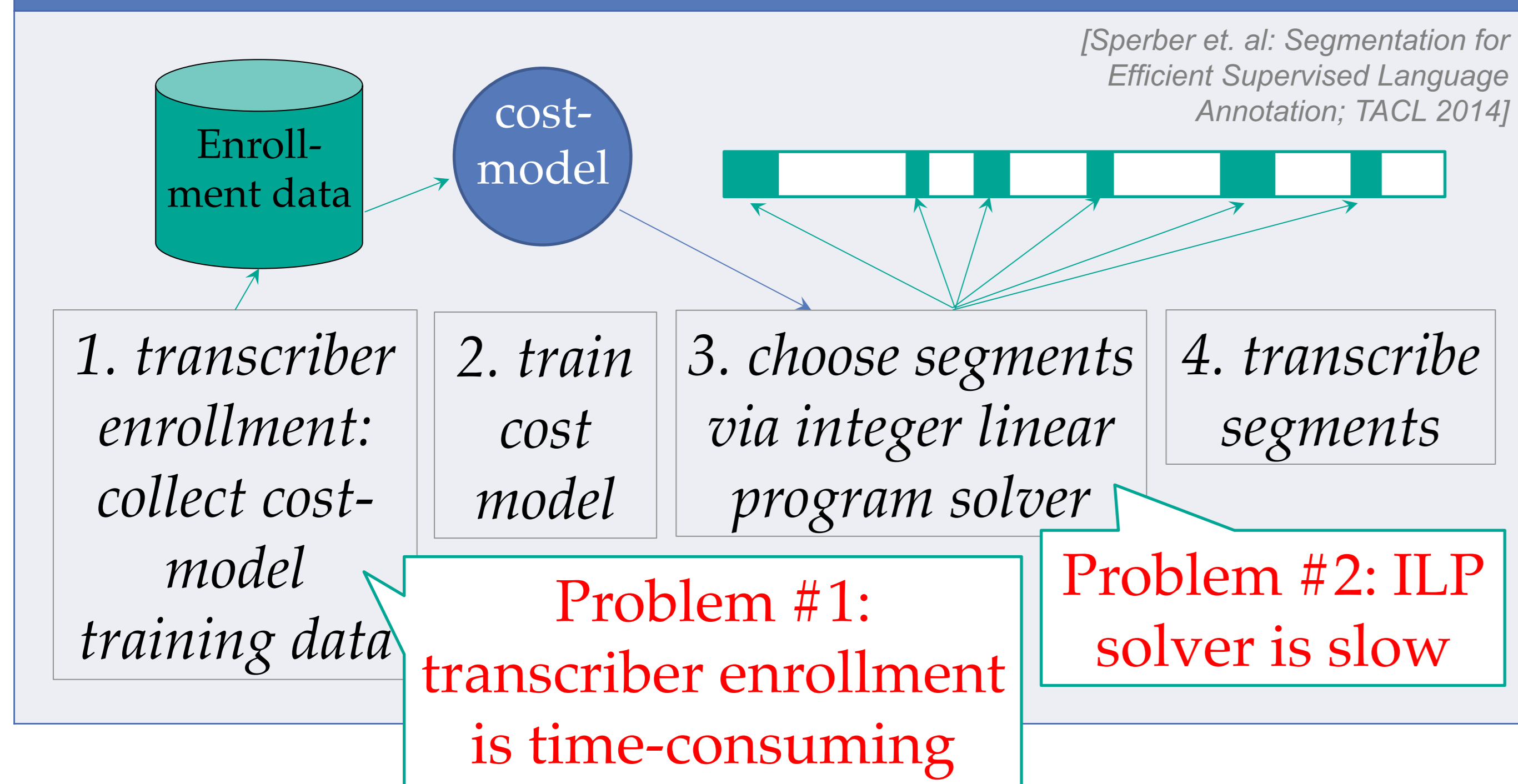
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**What to do when automatic speech recognition produces too many errors, and manual transcription is too expensive?**

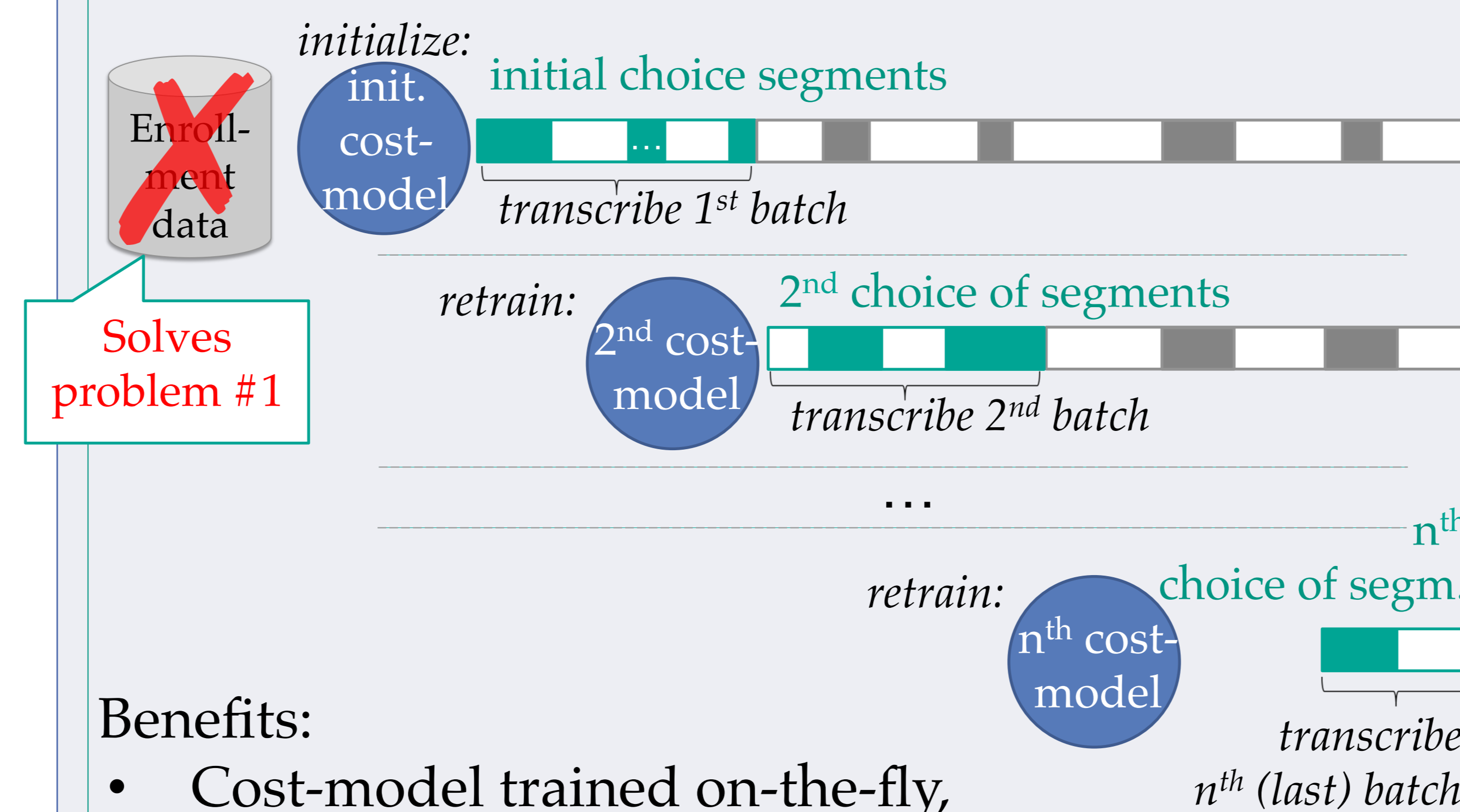


## Baseline



## Contributions

### 1. On-the-fly updating of cost model & segmentation



Benefits:

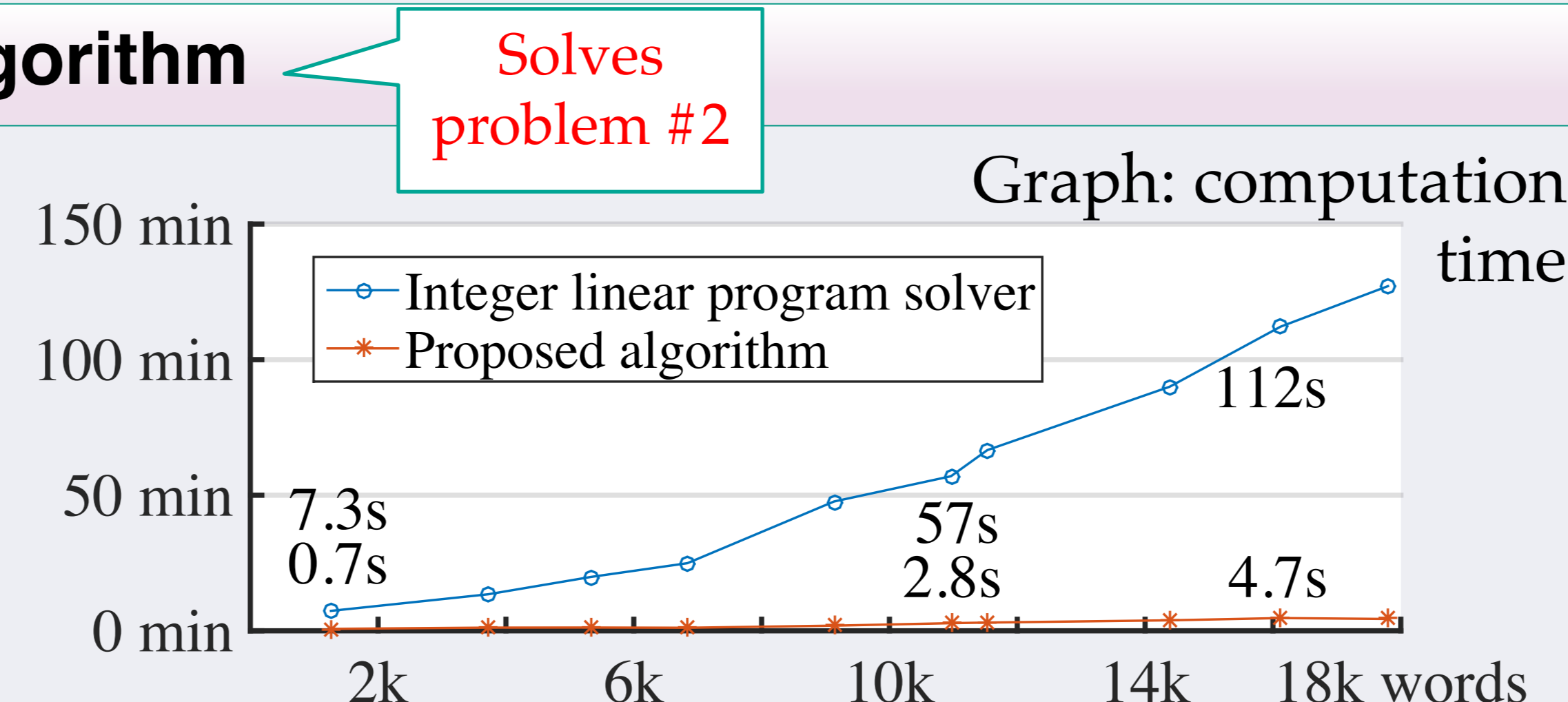
- Cost-model trained on-the-fly, making transcriber-enrollment unnecessary
- Choice of segments improves continually as cost model improves
- Recover from time-prediction errors → e.g. remove segments when running out of time

### On-the-fly Cost Modeling:

- Gaussian Process regression: supports a prior!
- Use crude prior: cost  $\approx$  2sec + 1sec per word.
- Unrealistic, but captures 2 key properties:
  1. Longer segments need more time.
  2. Cognitive overhead for switching segments.
- After each update, predictions get more accurate.

### 2. Fast segmentation algorithm

- Important: don't want the transcriber to wait while updating.
- Optimal choice of segments is NP-hard! (→ competing goals of min. cost vs. max. #corrections)
- Optimize combined objective:  $\lambda \# \text{corrections} - (1-\lambda) \text{cost}$  via dynamic programming.
- Binary search to find  $\lambda$  that comes closest to time budget.

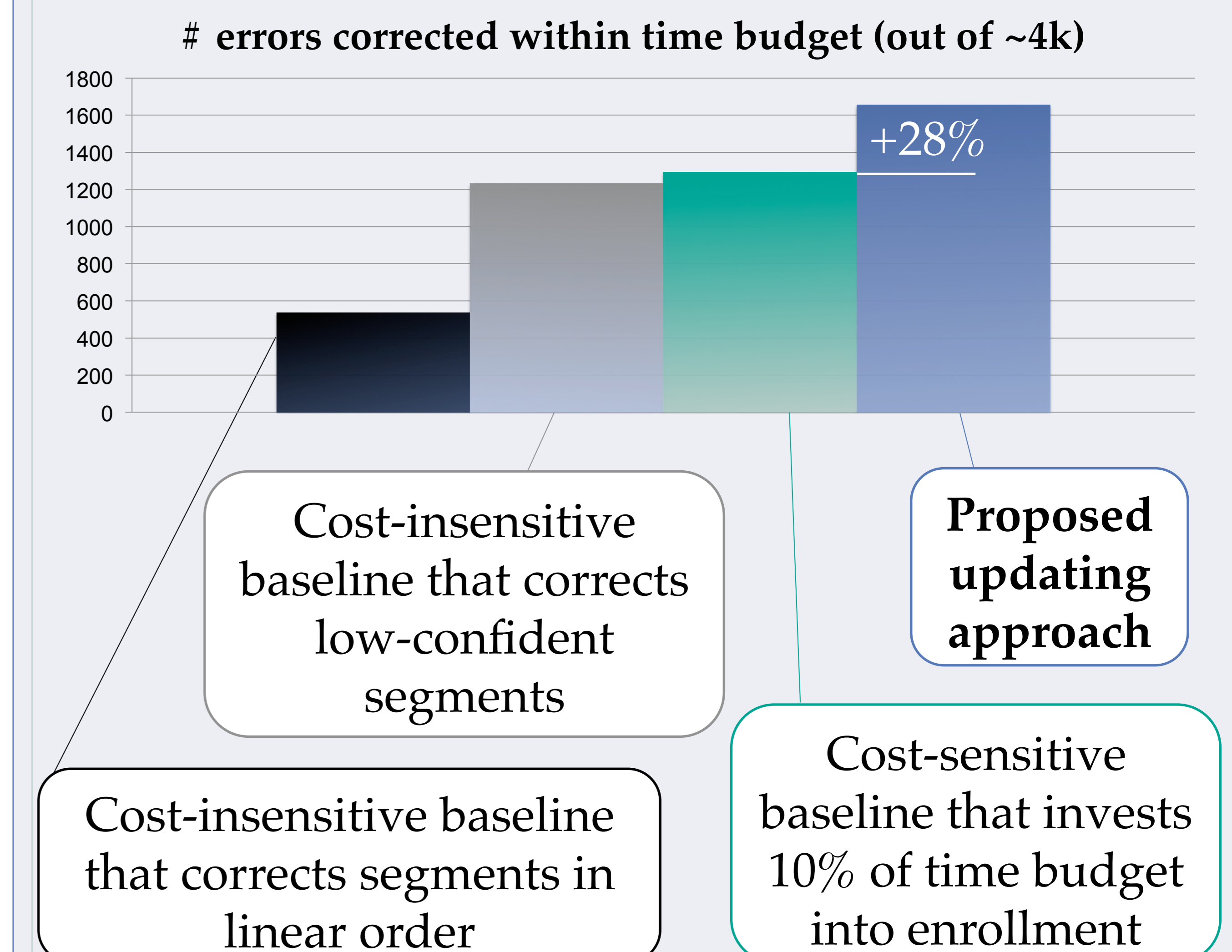


## Experiments

### Setup

- Task: Correct automatic transcripts of 10 TED talks (104 minutes of audio).
- Available time budget: 100 minutes.
- Simulating a realistic transcriber:
  - Train a cost model on correction times observed from a real transcriber.
  - Apply noise to output times.
  - Assume that transcriber behaves like this oracle cost-model (and perfectly corrects all errors).

### Simulation Results



### Wrap-Up

- Updating approach improves correction efficiency by 28% over prior cost-sensitive approach.
- Get rid of time-consuming transcriber enrollment.
- Fast updates remove transcriber waiting time.