

# Why Good Engineers Give Bad Cost Estimates: Results of Psychological Research

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258%



275%



1100%



100%

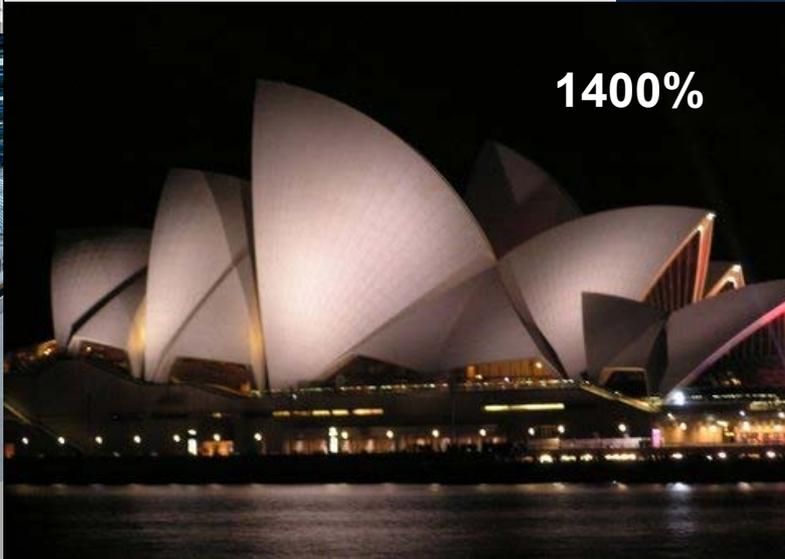
# Great Engineering - Bad Estimates



600%



220%



1400%



2200%

# Bad Estimates - as Old as Human History

Pharaoh Snefru's engineers were some of the first humans in the recorded history to register a bad estimate.

Their ruler's tomb had 600% schedule overrun.



Medium Pyramid collapsed

Bent Pyramid cracked open



He died before his third (Red Pyramid) was finished

# Bad Costing – Universal Problem

- Bad estimates are everywhere:
  - Construction
  - Transportation
  - Military
  - Film making
  - Family vacation to Hawaii
- Bad costing knows no borders or time period.

# Causes of Overruns

- Commonly blamed for overruns:
  - Scope changes
  - Poor communication
  - Technical issues
  - New technology
  - Acts of god
- But are these the *main* culprits?

- **Thesis:** Bad cost estimating is universal because psychological effects critically distort human judgment.
- We conducted a simple experiment to measure the power of psychology on estimators.

# Dishwashing Experiment

- Participants in the on-line experiment were asked to estimate the time needed to perform a simple task – washing the dishes shown below.
- Random participants were asked slightly different questions to test psychological effects.



- 5 psychological effects were tested:
  1. Anchoring Bias
  2. Q&A Mismatch
  3. Decomposition
  4. Reserve Fallacy
  5. Optimism
- 507 volunteers participated: 142 NASA employees, 305 college students and 60 other adults.
- ~2300 data points were collected to determine quantitative strength of effects.

# Effect #1: Anchoring Bias

**Anchoring Bias occurs when the question suggests a wrong answer.**

“You have an allocation of \$1M, what is your estimate?”

“I have a bogey of \$400k for your system. Give me your own estimate by tomorrow.”

# 1. Anchoring Results

- Unanchored question: “How long will it take to clean this kitchen?”
- **30 min**
- Anchored question: “George took 10 minutes. How long will it take to clean this kitchen?”
- **24 min**
- **Psychological effect:** Managers frequently anchor the initial estimate to the wrong value which is later very difficult to change.

## Effect #2: Q&A Mismatch

**Q&A Mismatch happens when the intention of the question is missed by the answer.**

- For example, is the question “What is your cost estimate for this robotic arm?” a request for a mean, 90% confidence or something else?

## 2. Q&A Mismatch Results

- (A) “How long will it take you to clean the kitchen?”  
**30 min**
- (B) “How long will it take you 90% of the time?”  
**39 min**
- (C) “How long will it take you 50% of the time?”  
**31 min**
- **Psychological effect:** When managers ask a general question type (A), they implicitly expect a high confidence answer like (B), but usually receive a 50/50 answer like (C).

# Effect #3: Decomposition

**Decomposition is breaking the estimate into smaller parts which people feel will improve accuracy.**

“Break down your robotic arm task into level 5 WBS elements and cost them by Monday.”

# 3. Decomposition Results

**No decomposition:** “How long will it take to clean this kitchen?”

**30 min.**

**Decomposition:** “Give estimates for cleaning the bowls, silverware, pots and pans, and add together.”

**31 min.**

- **Effect:** Decomposition did not change the result
  - Decomposition was more time consuming than helpful.
  - Deep decompositions often miss the cost of interfaces (for example, walking to the drawer to put away the dishes.)

## Effect #4: Reserve Fallacy

Reserve Fallacy describes the fact that people are comfortable with unfounded intuitive reserve levels.

“This proposal includes a robust 30% budget reserve.”

## 4. Reserve Fallacy Results

(A) “How long will it take to clean this kitchen?”

**30 min**

(B) “I am 90% sure that the time is no more than plus or minus \_\_ min.”

**9 minutes = 30%**

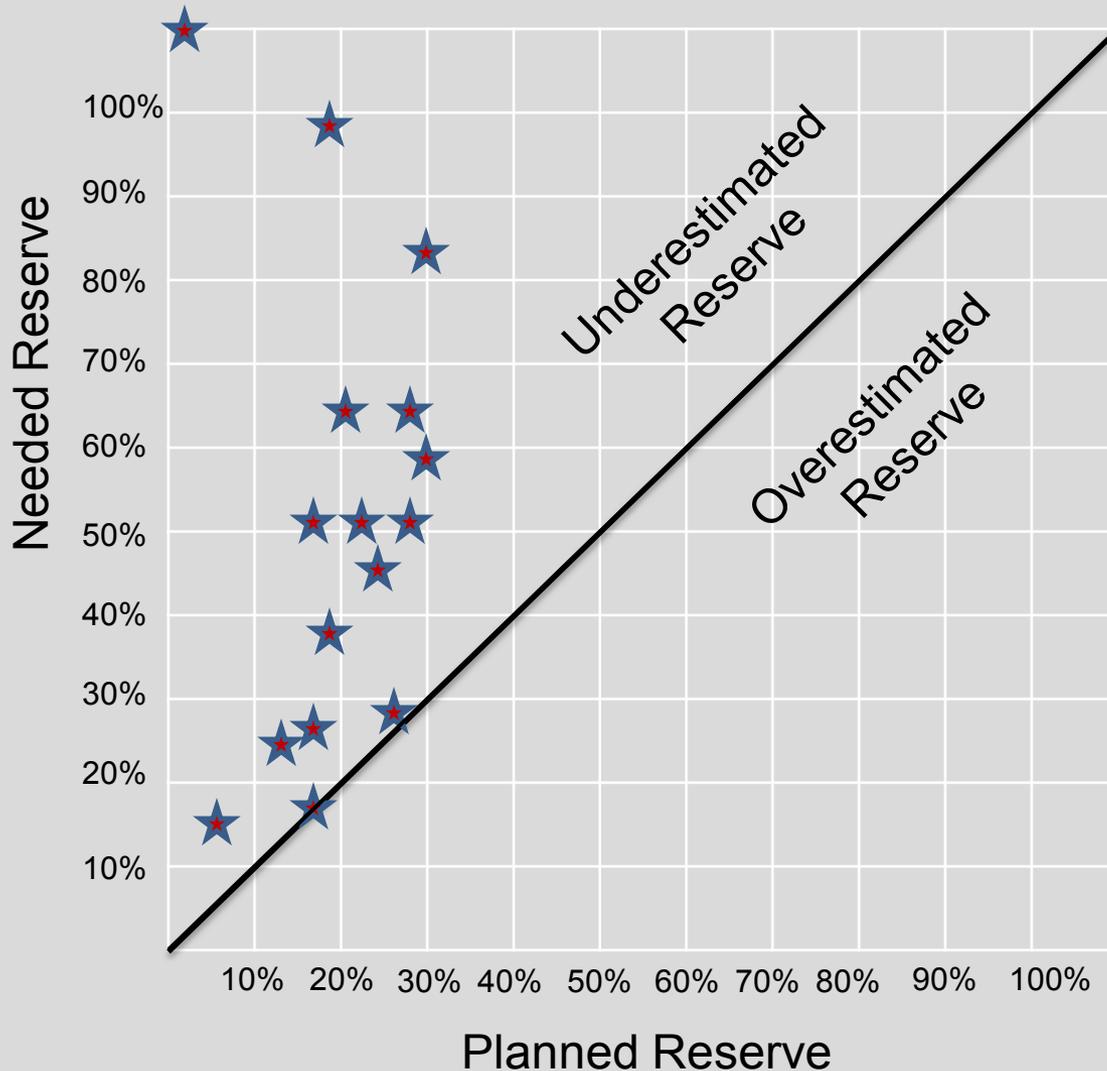
(C) “I am 99% sure that it will take me no more than \_\_ minutes.”

**45 min (15 minutes = 50%)**

### **Psychological Effect:**

People display high confidence in a 30% reserve. Such high confidence would have been more appropriate for a 50% reserve.

# Large Projects Reserve Comparison



**The average amount of budget reserve required for 18 large projects surveyed is 52%.**

# Effect #5: Optimism

**People tend to be overly optimistic in planning.**

“This time, there will be no delays.”

“All the risks have been mitigated by the last project.”

## 5. Optimism Results

How long will it take to clean the kitchen:

**30 min**

(A) “Best case scenario - nothing goes wrong.”

**27 min**

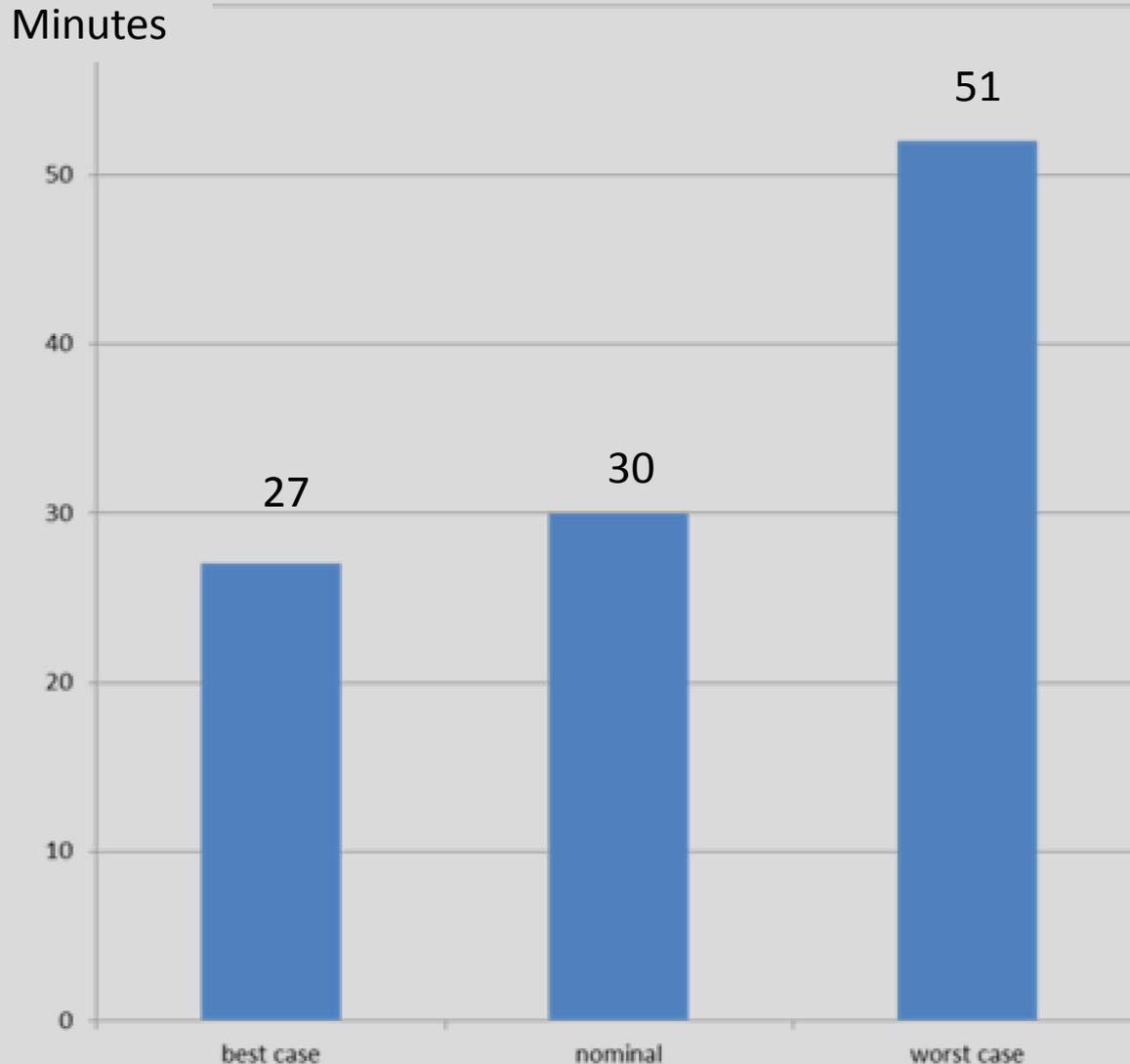
(B) “Worst case scenario - everything goes wrong.”

**51 min**

(C) “George took 40 minutes. How long will it take you”

**30 min**

# 5. Optimism Results



- The expected time to clean the kitchen was almost identical to the best case scenario.
- Optimistic anchoring worked very well, pessimistic anchoring failed.

# Conclusions

- **Psychology distorts cost estimates.**
- To counter:
  - Train the managers **not to anchor.**
  - Use **Financial Language** not common language.
  - Deep **decompositions do not improve accuracy.**
  - **Calculate** the **reserve based on risk.**
  - Combat **optimism** by baselining historical and likely risks.