

# Programming by example: efficient, but not “helpful”



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# About these slides and this work

- Presented at PLATEAU'18 by Drew Goldman, a high school student
- The paper is available at [link](#)
- A “younger” version of this talk can be found at <https://www.youtube.com/watch?v=75KemPBNh2c>

# Scripting can be difficult

Print all .pdfs in a directory and subdirectories

e.g. print → OOPSLA18/main.pdf , PLATEAU18/figs/graph.pdf  
no print → OOPSLA18/main.tex ,

```
$> find . -type f -name '*.pdf' | xargs print {} \;
```

# Scripting can be really difficult

Construct links for a list of files:

e.g. file.jpg → `<a href="file.jpg">file</a>`

```
$> sed/\(^[a-zA-Z0-9]+\)\.\([a-z]+\)/\<a href=\="\1\.\2"\>\1\</a\>/g
```

# Programming by Example (PBE)

Provide examples of intended functionality with **StriSynth**

PARTITION:

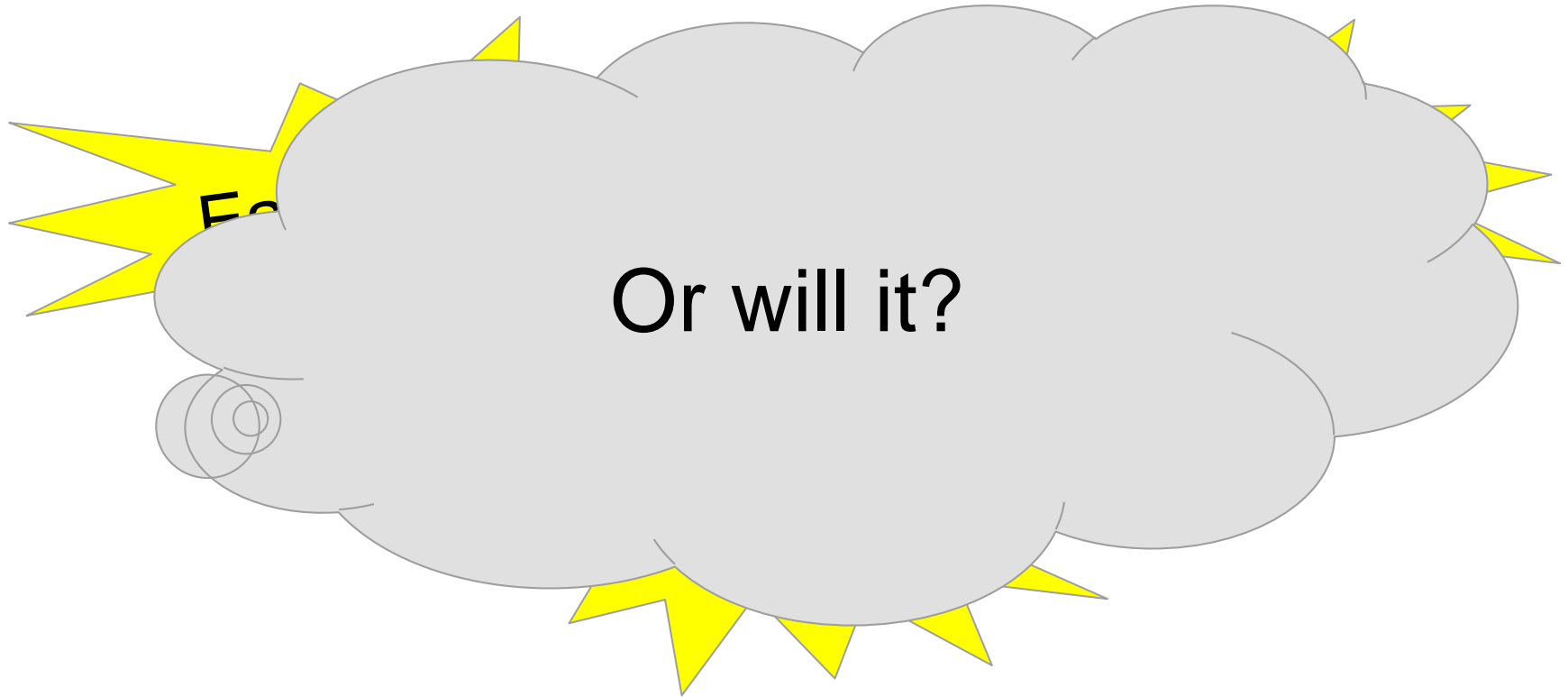
Valid → OOPSLA18/main.pdf , PLATEAU18/figs/graph.pdf

Invalid → OOPSLA18/main.tex

TRANSFORM

file.jpg → `<a href="file.jpg">file</a>`

**PBE will solve all your problems**



# Goal of the study

*Traditionally:*

Is StriSynth (and PBE for scripting) more efficient than PowerShell for real world users?

*Additionally:*

Is StriSynth (and PBE for scripting) a tool real world users want to use?

Are these two questions different?

# Study Design

- 1) A tutorial on both PowerShell and StriSynth that introduced the paradigm and syntax.
- 2) Complete three scripting tasks in PowerShell:
  - a) Extract filenames from a directory listing
  - b) Move files with \*.png to imgs/
  - c) Printing pdfs from a list of various file types
- 3) Complete the same three scripting tasks in StriSynth.
- 4) A post-study survey.



# Study Design

Run in-person for every one of the 27 participants

Participants used our laptop for a consistent development environment/experience

The study lasted about 50 minutes for each participant.

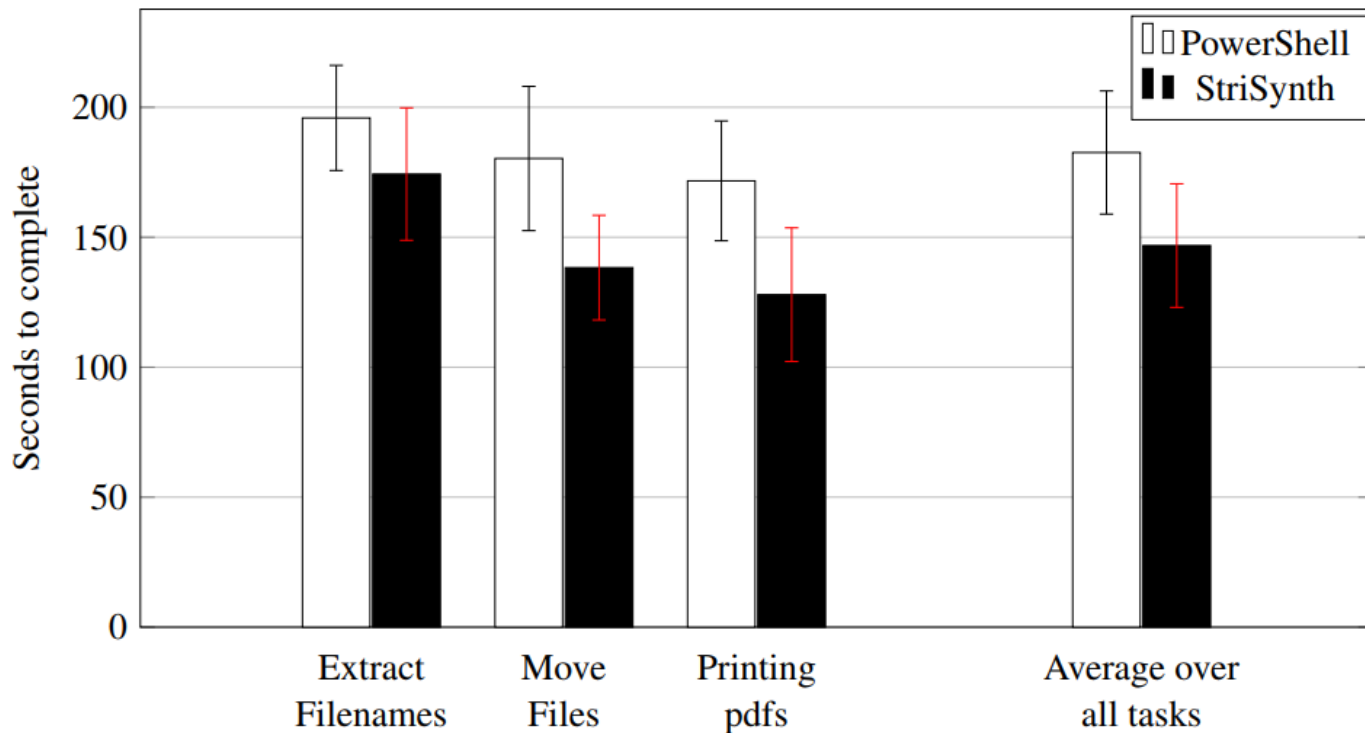
Used randomized condition order:

Group A (N=12) used PowerShell (StriSynth A) first

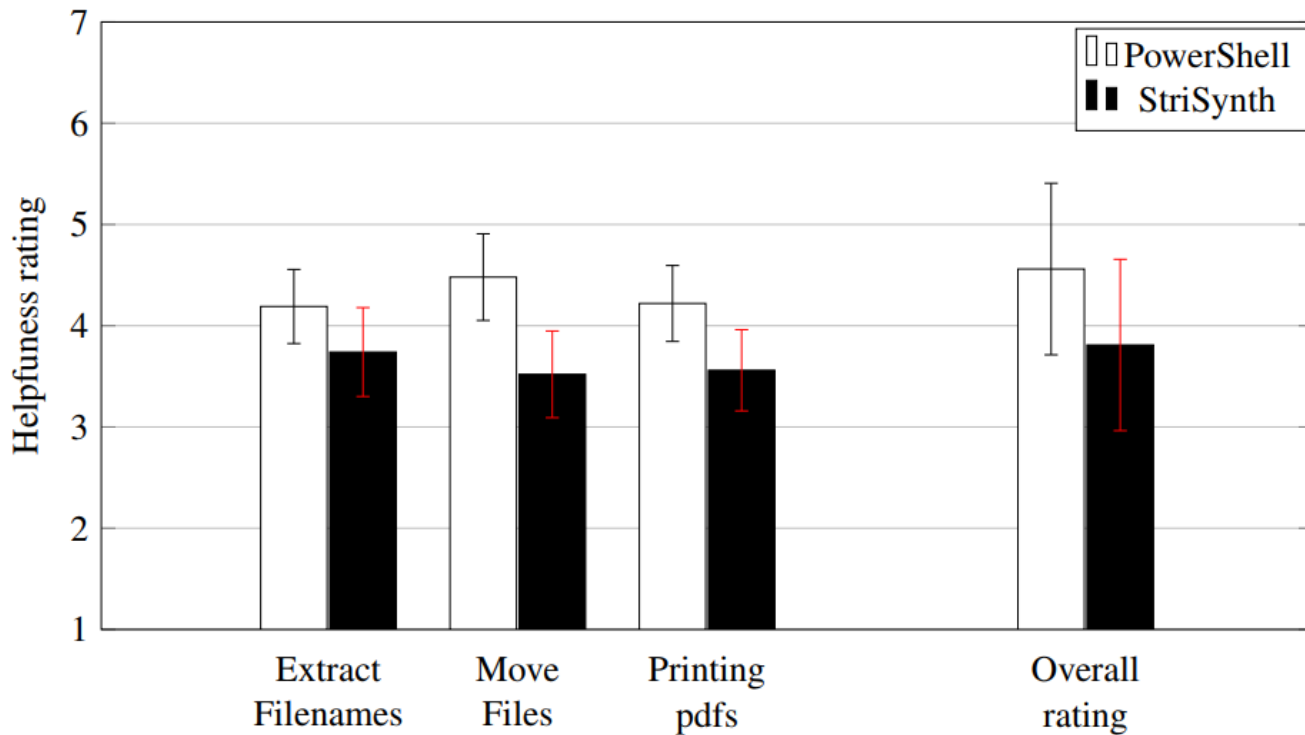
Group B (N=15) used StriSynth (StriSynth B) first

All materials available online: <https://github.com/santolucito/StriSynthStudy>

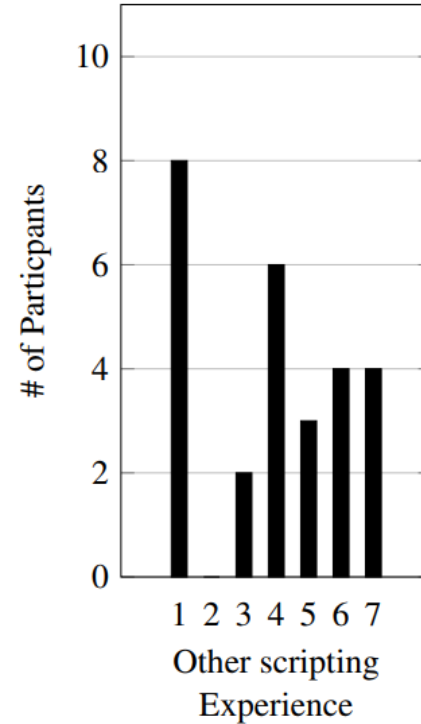
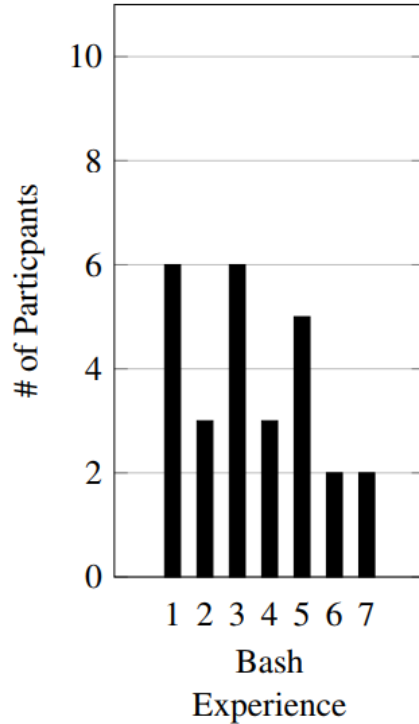
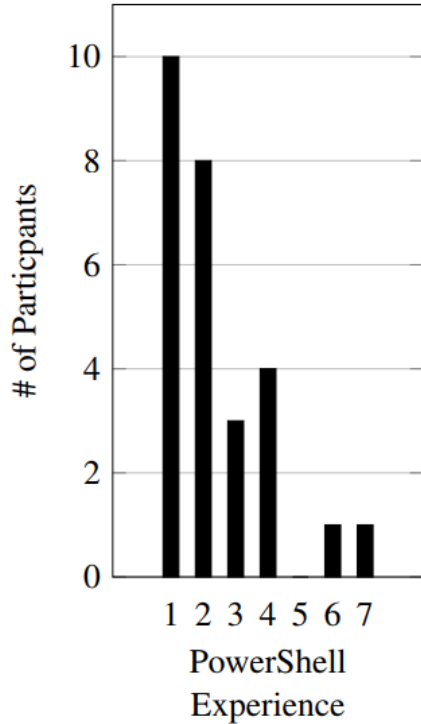
# PBE is faster than scripting



# PBE is less “helpful” than scripting



# Participants were real world users

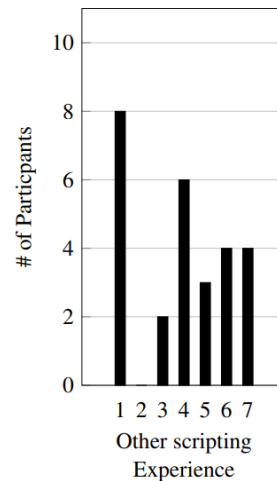
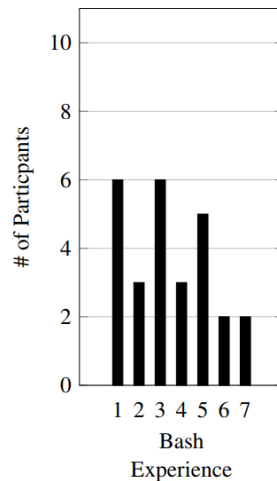
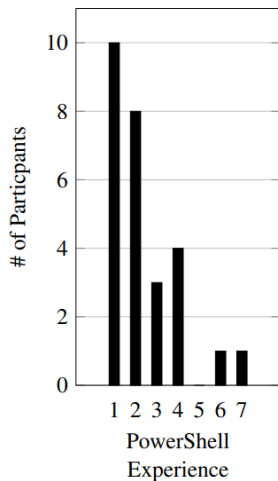


# Participants were real world users

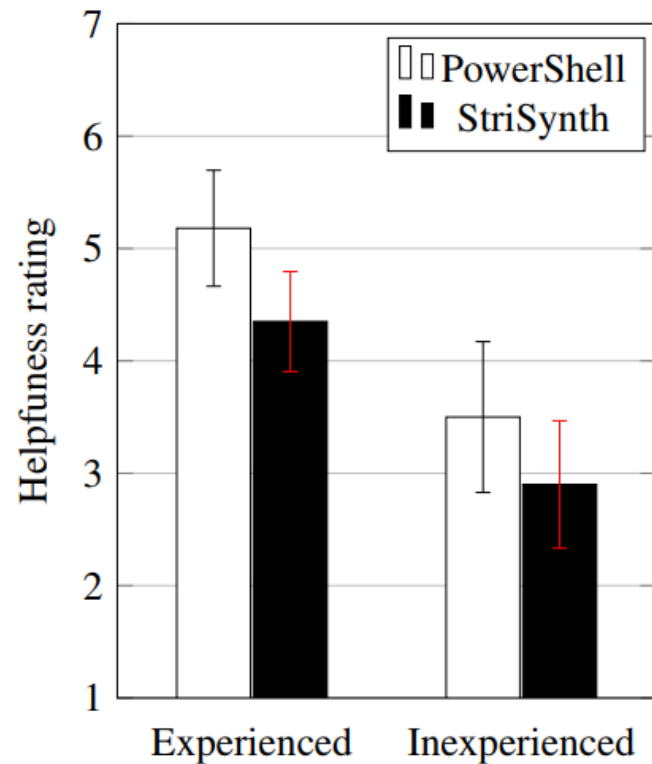
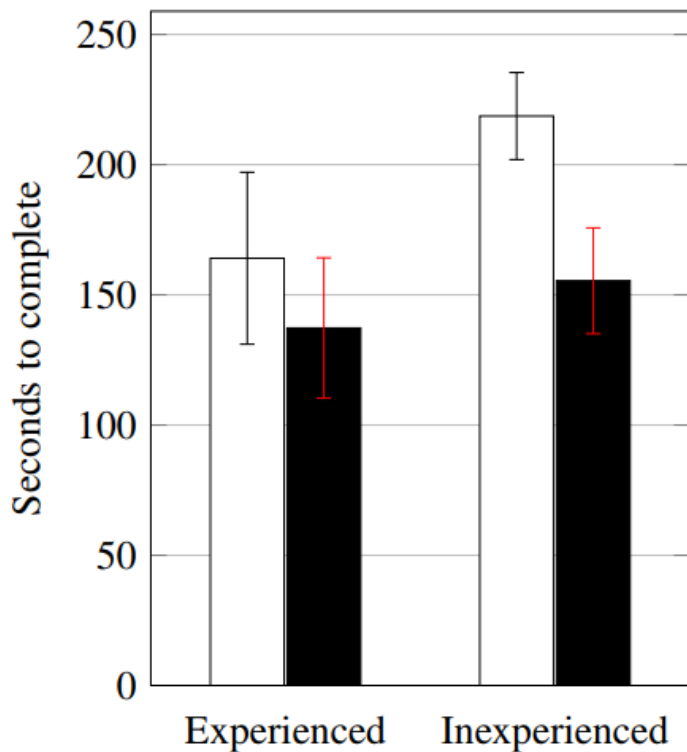
Despite some prior experience with PowerShell,  
StriSynth was still more efficient.

This distribution is very different when  
participants are PhD students.

Could this prior experience have been  
a factor in “helpfulness”?



# Similar results across skill level



# How are efficiency and helpfulness different?

- The “interface” of StriSynth
  - Similar to PowerShell (command line tool)
- Trust in the result
  - StriSynth generates an English explanation after synthesis
- Perceived lack of control
- Programmers enjoy programming

# Quick tips for synthesis user studies

**Measure more rather than less:** Running a study has a high fixed cost, but extending each participant's study time is relatively cheap. Ask users to complete a survey with more questions than you think you need.

**Need-to-please bias:** Users are biased towards the researcher's tool. Present both the synthesis tool and the "traditional" approach as your own tools in the study.

**Selection bias:** PhD students (usually) are not the target user group - reach out to companies to recruit the "right kind" of user.



# Moving forward

Further studies

- What did users mean by “helpfulness”?
- How does this transfer to other domains of PBE and program synthesis?

Generally, what benchmarks should we be using?

- Speed of synthesis algorithm
- Coverage of benchmark problems
- Speed of users to complete tasks
- Preference, helpfulness, something else