## Specific Examples, Generic Elements and Size Tuning Tools for Overcoming Student Roadblocks in Linear Algebra

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## My Background

- Fifteen years at PLU - a medium-sized, liberal arts university
- 15-20 math-related majors per year, all take linear algebra as sophomores or juniors.
- Plus some physics, CS and econ majors, also some math/stats minors
- We offer a single, proof-based linear algebra course
- Half of students take an Intro to Proofs course first
- Fifteen years at a medium-sized state university with a masters in math and a joint PhD in Computational Science
- 15-20 math majors per year, most of whom took two semesters of proof-based linear algebra
- We also offered a low-proof matrix theory course for math ed, and two graduate computational matrix theory courses
- Half of students in first proof-based course took Discrete Math first
- Thirty years as a researcher in combinatorial matrix theory
- (Thank you, Professor Hans Schneider)


## Student Problems in Proofs (1)

- Linear Algebra is the often the first math course in which sets play an explicit and fundamental role.
- Linear Algebra students typically struggle with writing proofs for set-based results.

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- Putative Proof: " $(4,3)$ and $(5,7)$ are in $\mathbb{R}^{n}$, and $(4,3)+(5,7)=(9,10)=(5,7)+(4,3) . "$
- A specific example is employed to prove the truth of a universal statement, and a proof for $\mathbb{R}^{2}$ dispatches $\mathbb{R}^{n}$ for all $n$. Note that specifying $\mathbb{R}^{47}$ rather than $\mathbb{R}^{n}$ blocks student from using $\mathbb{R}^{2}$. Since 47 is too large to explicitly write each entry, students are pushed towards focusing on a general entry.


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- This is a proof, but of not of the desired result.


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- Except that it does sometimes happen. The student has failed to convince us because the entries in the argument are not fully specified, allowing the possibility for $a_{1}=a_{2}=0$ or $b_{1}=b_{2}=0$.


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- In the first "proof", a specific example "verifies" a universal statement.
- In the second "proof", a generic example falsely contradicts a false universal statement. The student fails to see the need for a specific example.


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- "We want to show a property can fail for some elements in a set. What is a often good way to begin?"
- This (eventually) prompts students to volunteer, "Look for a specific element (counterexample) in the set."


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- The arbitrary aspects overwhelm the students, concealing that they do understand the importance of triangularity here.
- Most students can generate generic elements and perform the matrix algebra to correctly show that the sum of two $3 \times 3$ upper triangular matrices is upper triangular.


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- Most students can generate the generic elements and perform the matrix algebra to correctly show that the product of two $3 \times 3$ upper triangular matrices is upper triangular.


## Four Key Strategies for Student Proof Success

(1) Emphasize the role of specific (fully specified) examples as examples to highlight definitions, and, more importantly, as counterexamples to universal statements.
(2) Emphasize what a generic element from a set is, how to write one or more generic elements from a set, and what role they play in proofs about sets.
(3) Emphasize the different and noninterchangeable roles of specific examples and generic elements.
(9) Thoughtfully tune the sizes of vectors and matrices in problems to focus students on the primary idea at hand.

## Spans are the Unsung Heroes of Linear Algebra ... but ...

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"Let $S$ be a nonempty subset of $\mathbb{R}^{n}$. Show that $\operatorname{span}(S)$ is closed under vector addition?
- Size tuning suggests a cascade of examples and problems.
- If $\mathbf{u}, \mathbf{v}, \mathbf{w} \in \mathbb{R}^{n}$, then

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\operatorname{span}(\mathbf{u}, \mathbf{v}, \mathbf{w})=\left\{c_{1} \mathbf{u}+c_{2} \mathbf{v}+c_{3} \mathbf{w}: c_{1}, c_{2}, c_{3} \in \mathbb{R}\right\} .
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$\operatorname{span}(\mathbf{u}, \mathbf{v}, \mathbf{w})=\left\{c_{1} \mathbf{u}+c_{2} \mathbf{v}+c_{3} \mathbf{w}: c_{1}, c_{2}, c_{3} \in \mathbb{R}\right\}$.
- Give a generic element of $\operatorname{span}(\mathbf{u}, \mathbf{v}, \mathbf{w})$. (Hint: It is not $c \mathbf{u}+c \mathbf{v}+c \mathbf{w}$, why not?)
- Give a second, different generic element of $\operatorname{span}(\mathbf{u}, \mathbf{v}, \mathbf{w})$.
- Show that $\operatorname{span}(\mathbf{u}, \mathbf{v}, \mathbf{w})$ is closed under vector addition.
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- If $S$ is a nonempty, possibly infinite subset of $\mathbb{R}^{n}$, then $\operatorname{span}(S)$ is the set of all linear combinations built using a finite number of vectors from $S$. To get a generic element of $S$, choose some positive integer $k$, choose $k$ vectors from $S$, and then form the linear combination: $\mathbf{x}=\sum_{j=1}^{k} c_{j} \mathbf{v}_{j}$ where $\mathbf{v}_{1}, \mathbf{v}_{2}, \ldots \mathbf{v}_{k} \in S$ and where $c_{1}, c_{2}, \ldots, c_{k} \in \mathbb{R}$.
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- Why can we assume that another generic element $\mathbf{y}$ in $S$ can be built with the same vectors $\mathbf{v}_{1}, \mathbf{v}_{2}, \ldots \mathbf{v}_{k} \in S$ ?
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- Prove $\operatorname{span}(S)$ is closed under vector addition by showing $\mathbf{x} \neq \mathbf{y}$ is in $S_{\underline{\underline{\underline{E}}}}$.
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- Jeff Stuart Pacific Lutheran University jeffrey.stuart@plu.edu

