

# Data-Driven Applications Inspiring Linear Algebra

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- To introduce students to techniques we as researchers use.
- Students preparing to graduate need skills for graduate school and/or a career in industry.

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- Classroom modules to inspire upper division math concepts in courses such as Real Analysis, Linear Algebra, PDEs, ODEs, and Mathematical Modeling
- Modules are being tested at several types of schools and classroom set ups, for transportability.
- After each implementation, we are editing and adding to the materials.

## Module Concept

<b>Common Application-Based Learning</b>	

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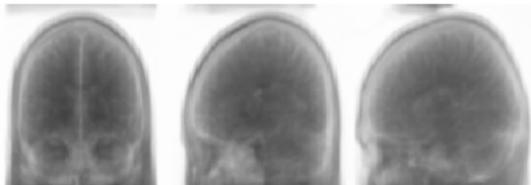
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## Radiography/Tomography Example

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## Inspired Topics

→ **Vector Spaces**

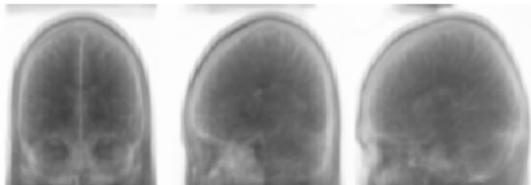
→ **Linear Transformations**

→ **Invertibility**

→ **Nullspace, Range Space**

→ **Singular Value Decomposition**

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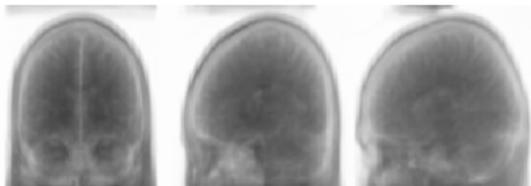
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Given radiographs with Noise

Reconstruct the object that produced them

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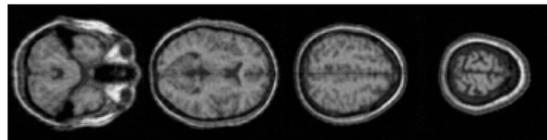
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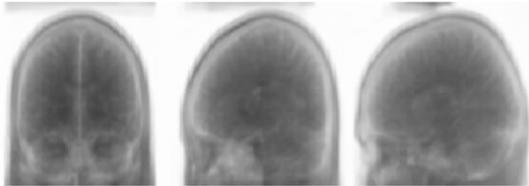
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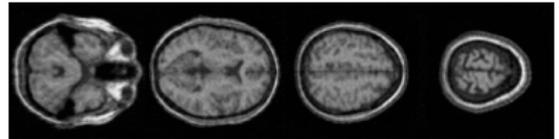
### Tools Learned:

Exploration

Linear Algebra Concepts

Writing

Matlab/Octave Commands



# Common Application-Based Learning: The Nullspace

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**Definition:** Let  $(V$  and  $W$  be vector spaces and  $T : V \rightarrow W$  be a linear transformation. We define the nullspace of  $T$  to be

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**Example N:** Let us now consider the real-life example of the linear transformation called the radiographic transformation...

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- Lab 1: Students are introduced to images. They play with arithmetic operations of images recognizing (without knowing previously about) vector space properties of the set of images. This leads to a discussion of linear combinations, span, and linear dependence of images.
- Lab2: Students create example radiographic transformations and find out later that these transformations are linear transformations.

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This lab is followed up with a discussion of “invisible” vectors. Because of their importance, we define the space of “invisible” vectors as the nullspace.

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In our second year, we have plans to collect a larger sample of data to get a better picture.

# What Students Say



## What Students Say

"Just wanted to mention that I like doing all of the linear algebra applications that we are doing. Although they are a lot of work (and they are A LOT of work), the labs are way more fun than the homework or the book."



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**" THE RADIOGRAPHY/TOMOGRAPHY  
LAB WAS AWESOME!!!**

I especially like the application to computer science because it showed how math and computer science can be used to solve modern problems."



## What Students Say

"I have loved learning about both the Heat Equation application and the Radiography/Tomography application in class this semester. Studying to be a middle school math teacher, it can be very frustrating taking difficult upper level classes. However, it is incredible to see how the math we learn in class can be used in the real world and makes the topics we learn much more interesting. I think adding this aspect to the class is extremely helpful and a great way to keep students engaged in the class."



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"I enjoyed learning about radiography–tomography. It was cool to be able to apply math and understand where this is used in real life."



## Contact Us

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**We're looking for beta testers for this spring.**