Matrixology (Linear Algebra)—Episode 1/24 MATH 122, Fall, 2016

Introduction

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Dept. of Mathematics & Statistics | Vermont Complex Systems Center Vermont Advanced Computing Core | University of Vermont













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Basics:

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Instructor: Prof. Peter Dodds
 Lecture room and meeting times:

Perkins 107, Tuesday and Thursday, 10:05 am to 11:20 am

- Office: Farrell Hall, second floor, Trinity Campus
- E-mail: peter.dodds@uvm.edu
- Course website:

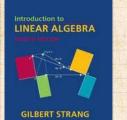
http://www.uvm.edu/ pdodds/teaching/courses/2016-08UVM-122

 Textbook: "Introduction to Linear Algebra" (3rd or 4th or 5th edition) by Gilbert Strang (published by Wellesley-Cambridge Press).

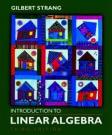




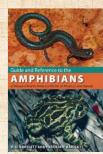
Our Textbook of Excellence:



4th Edition 🛛



3rd Edition



Unhelpful 🗆

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- "Introduction to Linear Algebra" by Gil Strang C;
- Textbook website: http://math.mit.edu/linearalgebra/C
- MIT Open Courseware site for 18.06 (=Linear Algebra):

http://ocw.mit.edu/...linear-algebra-spring-2010/





Yesness:

Money quote from George Cobb's review of Strang's book:

Do you want a book written by a mathematician with a lifetime experience using linear algebra to understand important, authentic, applied problems, a former president of the Society for Industrial and Applied Mathematics, ...

or do you want a book shaped mainly by the [a]esthetics of pure mathematicians with only a weak, theoretical connection to how linear algebra is used in the natural and social sciences?

- George Cobb: Robert L. Rooke Professor of Mathematics and Statistics, Mount Holyoke College
- Full review here C [amazon]

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Gil Strang, Exalted Friend of the Matrix: Professor of Mathematics at MIT since 1962.



These are 121 cupcakes with my favorite -1, 2, -1 matrix. It was the day before Thanksgiving and two days before my birthday. A happy surprise.

 Many awards including MAA Haimo Award r for Distinguished College or University Teaching of Mathematics

Rhodes Scholar.Legend.

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More on Laplacian matrices, graphs, and other madnesses here .

▶ (Strang's Wikipedia page is here .





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Admin:

Potential paper products:

1. Outline

Papers to read:

- 1. "The Fundamental Theorem of Linear Algebra" ^[2]
- 2. "Too Much Calculus" [3]

Office hours:

 10:00 to 11:55 am Wednesdays, Farrell Hall, second floor, Trinity Campus Episode 1/24: Introduction

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Team Matrixology We may try out Slack:

- Place for discussions about all things PoCS including assignments and projects.
- Once invited, please sign up here: http://team-matrixology.slack.com
- Very good: Install Slack app on laptops, tablets, phone.

slack

Everyone will behave wonderfully.

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Grading breakdown:

1. Levels (40%)

- Ten one-week assignments.
- Lowest assignment score will be dropped.
- The last assignment cannot be dropped!
- Each assignment will have a random bonus point question which has nothing to do with linear algebra.

2. Challenge Levels (30%)

Three 75 minutes tests distributed throughout the course, all of equal weighting.

3. Final Boss Level (20%)

- Structure Str
- Thursday, December 15, 1:30 pm to 4:15 pm, in Perkins 107.

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Grading breakdown:

4. Mini-levels (10%)

- Most meeting times will end with a 10 to 15 minute mini-level.
- There will be around 20 mini-levels.
- 5. Homework (0%)—Problems assigned online from the textbook. Doing these exercises will be most beneficial and will increase happiness.
- 6. General existence—it is extremely desirable that students attend class, and class presence will be taken into account if a grade is borderline.

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Questions are worth 3 points according to the following scale:

- 3 = correct or very nearly so.
- 2 = acceptable but needs some revisions.
- 1 = needs major revisions.
- 0 = way off.





Schedule: The course will mainly cover chapters 2 through 6 of the textbook. (You should know all about Chapter 1.)

Week # (dates)	Tuesday	Thursday			
1 (8/30 and 9/01)	$\mathbf{A}\vec{x} = \vec{b}$	$\mathbf{A}\vec{x} = \vec{b}$ + Level 1			
2 (9/06 and 9/08)	$\mathbf{A}\vec{x} = \vec{b}$	$\mathbf{A}\vec{x} = \vec{b}$ + Level 2			
3 (9/13 and 9/15)	$\mathbf{A}\vec{x} = \vec{b}$	$\mathbf{A}\vec{x} = \vec{b}$ + Level 3			
4 (9/20 and 9/22)	$\mathbf{A}\vec{x} = \vec{b}$ and review	Challenge Level 1			
5 (9/27 and 9/29)	Big picture	Big picture + Level 4			
6 (10/04 and 10/06)	Big picture	Big picture + Level 5			
7 (10/11 and 10/13)	Big picture	Big picture + Level 6			
8 (10/18 and 10/20)	Big picture	Challenge Level 2			
9 (10/25 and 10/27)	Normal equation	Gram-Schmidt Process +			
		Level 7			
10 (11/01 and 11/03)	Eigenstuff	Eigenstuff + Level 8			
11 (11/08 and 11/10)	Determinants	Determinants + Level 9			
12 (11/15 and 11/17)	Eigenstuff	textitChallenge Level 3			
13 (11/22 and 11/24)	Thanksgiving	Thanksgiving			
14 (11/29 and 12/01)	Positive Definite Matrices	SVD			
	+ Level 10				
15 (12/06)	SVD				

Important dates:

- 1. Classes run from Tuesday, August 30 to Tuesday, December 6.
- 2. Add/Drop, Audit, Pass/No Pass deadline—Monday, September 12.
- Last day to withdraw—Monday, October 31 (Sadness!).
- Reading and Exam period—Saturday, December 10 to Friday, December 16.

More stuff:

Do check your zoo account for updates regarding the course.

Academic assistance: Anyone who requires assistance in any way (as per the ACCESS program or due to athletic endeavors), please see or contact me as soon as possible. Episode 1/24: Introduction

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More stuff:

Being good people:

- In class there will be no electronic gadgetry, no cell phones, no beeping, no text messaging, etc. You really just need your brain, some paper, and a writing implement here (okay, and Matlab).
- 2. Second, I encourage you to email me questions, ideas, comments, etc., about the class but request that you please do so in a respectful fashion.
- Finally, as in all UVM classes, Academic honesty will be expected and departures will be dealt with appropriately. See http://www.uvm.edu/cses/ for guidelines.

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Even more stuff:

Late policy: Unless in the case of an emergency (a real one) or if an absence has been predeclared and a make-up version sorted out, assignments that are not turned in on time or tests that are not attended will be given 0%.

Computing: Approximately 2 out of 10 questions per assignment will be Matlab based.

Note: for assignment problems, written details of calculations will be required.

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Why are we doing this? Big deal: Linear Algebra is a body of mathematics that deals with discrete problems.

Many things are discrete:

- Information (0's & 1's, letters, words)
- People (sociology)
- Networks (the Web, people again, food webs, ...)
- Sounds (musical notes)

Even more:



If real data is continuous, we almost always discretize it (0's and 1's) Episode 1/24: Introduction

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Why are we doing this? Linear Algebra is used in many fields to solve problems:

- Engineering
- Computer Science
- Physics

- Biology
- Ecology
- Economics
- Science of the Sociotechnocene



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Big example: Google's Pagerank 🗹

Some truth:

- Linear Algebra is as important as Calculus...
- Calculus \equiv the blue pill...





Why are we doing this?

TOOK EVERY CALCULUS CLASS

EVERYTHING

DISCRETE

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imgflip.com

You are now choosing the red pill:

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... or the blue pill?

The red pill...





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The Truth:

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Calculus is the Serpent's Mathematics.

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The Platypus of Truth:



Platypuses are masters of Linear Algebra.

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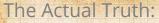
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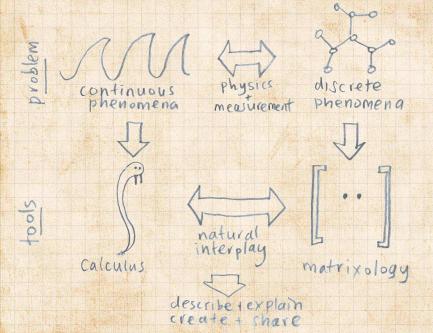
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Matrices as gadgets:

A matrix A transforms a vector \vec{x} into a new vector \vec{x}' through matrix multiplication (whatever that is):

$$\vec{x}' = A \vec{x}$$

We can use matrices to:

- Grow vectors
- Shrink vectors
- Rotate vectors
- Flip vectors
- Do all these things in different directions
- Reveal the true ur-dystopian reality.

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Digital photographs are matrices:

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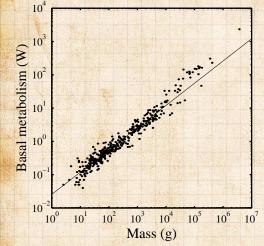
Usually three matrices: RGB color model .



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Best fit line (least squares):



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Linear

this

Calculus

algebra does

beautifully;

version is clunky.

And evil.

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From "Re-examination of the '3/4' law of metabolism" ^[1] Dodds, Rothman, and Weitz, Journal of Theoretical Biology, 209, 9–27, 2001



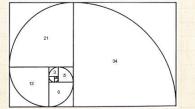
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The many delights of Eigenthings:

Using Linear Algebra we'll somehow connect:







 Fibonacci Numbers,

- Golden Ratio,
- Spirals,
- Sunflowers, pine cones,

Harvard Square.

...

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This is a math course:

WAX OFF WAX ON

http://www.pimpartworks.com/artwork/randomsteveo/Wax-On-Wax-Off

It's all connected. "More later."

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Three key problems of Linear Algebra

1. Given a matrix A and a vector \vec{b} , find \vec{x} such that

 $A\vec{x} = \vec{b}.$

2. Eigenvalue problem: Given A, find λ and \vec{v} such that

$$A\vec{v} = \lambda\vec{v}.$$

3. Coupled linear differential equations:

$$\frac{\mathsf{d}}{\mathsf{d}t}y(t) = A\,y(t)$$

Our focus will be largely on #1, partly on #2.

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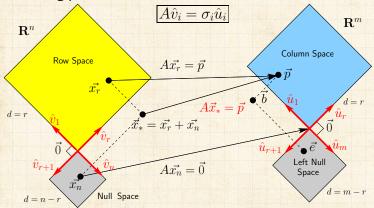
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Major course objective:

To deeply understand the equation $A\vec{x} = \vec{b}$, the Fundamental Theorem of Linear Algebra, and the following picture:



What is going on here? We have 24 episodes to find out...

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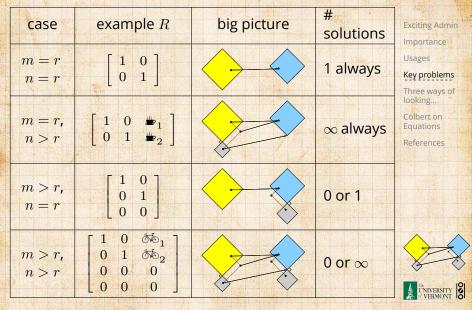
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The fourfold ways of $\mathbf{A}\vec{x} = \vec{b}$:

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Our new BFF: $A\vec{x} = \vec{b}$ Broadly speaking, $A\vec{x} = \vec{b}$ translates as follows: • \vec{b} represents reality (e.g., music, structure) • A contains building blocks (e.g., notes, shapes)

▶ \vec{x} specifies how we combine our building blocks to make \vec{b} (as best we can).

How can we disentangle an orchestra's sound?



► Radiolab G's amazing piece: A 4-Track Mind G

What about pictures, waves, signals, ...?

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Is this your left nullspace?:

及網文写で感が給しオ会観美イカ

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Linear Algebra compliments/putdowns:

Wow, you have such a tiny/huge [delete as applicable] left nullspace!

LEFT NULL SPACES

▶ See also: The Dunning-Kruger effect. C

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Our friend $A\vec{x} = \vec{b}$

What does knowing \vec{x} give us?

If we can represent reality as a superposition (or combination or sum) of simple elements, we can do many things:

- Compress information
- See how we can alter information (filtering)
- Find a system's simplest representation
- Find a system's most important elements
- See how to adjust a system in a principled way

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Way 1: The Row Picture
Way 2: The Column Picture
Way 3: The Matrix Picture

Example:

Call this a 2 by 2 system of equations.

2 equations with 2 unknowns.

Standard method of simultaneous equations: solve above by adding and subtracting multiples of equations to each other = Row Picture. Episode 1/24: Introduction

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Row Picture—what we are doing:

- (a) Finding intersection of two lines
- (b) Finding the values of x₁ and x₂ for which both equations are satisfied (true/happy)
- A splendid and deep connection:
 (a) Geometry ⇒ (b) Algebra

Three possible kinds of solution:

- 1. Lines intersect at one point —One, unique solution
- 2. Lines are parallel and disjoint —No solutions
- 3. Lines are the same —Infinitely many solutions

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The column picture:

See

as

$$x_1 \begin{bmatrix} -1 \\ 2 \end{bmatrix} + x_2 \begin{bmatrix} 1 \\ 1 \end{bmatrix} = \begin{bmatrix} 1 \\ 4 \end{bmatrix}.$$

General problem

$$x_1\vec{a}_1+x_2\vec{a}_2=\vec{b}$$

Column vectors are our 'building blocks'
 Key idea: try to 'reach' *b* by combining (summing) multiples of column vectors *a*₁ and *a*₂.

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We love the column picture:

- Intuitive.
- Generalizes easily to many dimensions.

Three possible kinds of solution:

- 1. \vec{a}_1 not parallel \vec{a}_2 : 1 solution.
- 2. \vec{a}_1 parallel to \vec{a}_2 but not parallel to \vec{b} : No solutions.
- 3. \vec{a}_1 , \vec{a}_2 , and \vec{b} all parallel: infinitely many solutions.

(assuming neither \vec{a}_1 or \vec{a}_1 are $\vec{0}$)

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Difficulties:

- Do we give up if $A\vec{x} = \vec{b}$ has no solution?
- No! We can still find the \vec{x} that gets us as close to \vec{b} as possible.
- Method of approximation—very important!
- We may not have the right building blocks but we can do our best.





The Matrix Picture:

Now see

$$x_{1} \begin{bmatrix} -1\\ 2 \end{bmatrix} + x_{2} \begin{bmatrix} 1\\ 1 \end{bmatrix} = \begin{bmatrix} 1\\ 4 \end{bmatrix}.$$
$$\vec{x}_{-} \vec{h}_{-} \begin{bmatrix} -1 & 1 \end{bmatrix} \begin{bmatrix} x_{1} \end{bmatrix} - \begin{bmatrix} 1 \end{bmatrix}$$

as

$$A\vec{x} = \vec{b} : \begin{bmatrix} -1 & 1 \\ 2 & 1 \end{bmatrix} \begin{bmatrix} x_1 \\ x_2 \end{bmatrix} = \begin{bmatrix} 1 \\ 4 \end{bmatrix}$$

A is now an operator:

- \blacktriangleright A transforms \vec{x} into \vec{b} .
- Roughly speaking, A does two things to \vec{x} :
 - 1. Rotation/Flipping
 - 2. Dilation (stretching/contraction)

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The Matrix Picture

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Key idea in linear algebra:

- Decomposition or factorization of matrices.
- Matrices can often be written as products or sums of simpler matrices

•
$$A = LU, A = QR, A = U\Sigma V^T, A = \sum_i \lambda_i \vec{v} \vec{v}^T, \dots$$



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More Truth about Mathematics:

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The Colbert Report on Math C (February 7, 2006)

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References I

 P. S. Dodds, D. H. Rothman, and J. S. Weitz. Re-examination of the "3/4-law" of metabolism. Journal of Theoretical Biology, 209:9–27, 2001.
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[2] G. Strang. The fundamental theorem of linear algebra. The American Mathematical Monthly, 100(9):848–855, 1993. pdf

 [3] G. Strang. Too much calculus, 2002.
 SIAM Linear Algebra Activity Group Newsletter.
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