## Lectures Notes for Linear Algebra - Nathaniel Johnston

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## Introduction

Lecture Notes from Nathaniel Johnston

Why Study Linear Algebra?

1 Overview of Linear Algebra

## Part I

## Linear Algebra

## 1 Overview

- 1. Introduction to Vectors: Length, Dot Product, Linear Combination (Lecture 1 to 7)
- 2. Matrices: Addition, Scalar Multiplication, Matrix Multiplication, transpose (Lecture 8 to 13)
- 3. Linear Tranformation (Lecture 14 to 16)
- 4. System of Linear Equation (Lecture 17 to 21)
- 5. Inverse of a Matrix (Lecture 22 to 25)
- 6. Subspaces and Basis (Lecture 26 to 33)
- 7. Determinants (Lecture 34 to 36)
- 8. Eigenvalues and Eigenvectors (Lecture 37 to )
- 9. Diagonalization

### 2 Vectors in 2D

- 1. Vector Representation: coordinates, direction, length
- 2. Vector Manipulation: addition, multiplication by scalar
- 3. Geometric Interpretation of vector manipulation
- 4. Parallelogram Rule

## 2.1 problem

1. add and PPS with vectors

## 3 Vectors in Higher Dimensions

1. Properties of Vector Operations

- 1. Prove properties of vector operations
- 2. Apply vector properties to simplify vector

## 4 Linear Combinations

- 1. Linear Combinations
- 2. Standard Basis Vector  $(e_1, e_2, ...), e_1 = (1, 0, 0, ..., 0)$

## 4.1 problem

- 1. Determine if vector is a linear combination of sets of vector or not
- 2. Write vector as linear combination of standard basis vector

## 5 The Dot Product

- 1. Dot Product
- 2. Properties of Dot Product

### 5.1 problem

- 1. Perform dot product on two vectors
- 2. Prove properties of dot product
- 3. Use properties of dot product

## 6 The Length of a Vector

- 1. Length of a Vector
- 2. Properties of Vector Length
- 3. Unit Vector

## 6.1 problem

- 1. Calculate vector length
- 2. Prove properties of vector length
- 3. Use properties of vector length
- 4. Calculate Unit Vector using normalization

## 7 The Cauchy Schwarz and Triangle Inequalities

- 1. Cauchy-Schwarz Inegality:  $|v\cdot w| \leq ||v||||w||$
- 2. Triangle Inequlity

Remarque (Cauchy-Schwarz). The Cauchy-Schwarz Inequality gives us a relation between the dot product (wether v and w are in same direction) and the length of the vector

**Remarque** (Triangle Inequality). The triangle inequality tells us that if we go in a straight line, we walk a shorter distance than if we don't

### 7.1 problem

- 1. Proof for Cauchy-Schwarz
- 2. Proof for Triangle Inequality using Cauchy-Schwarz
- 3. Use the Cauchy-Schwarz Inequality to prove that no vector **v** and **w** produce dot product of 7

## 8 The Angle Between Vectors

- 1. Angle between vectors:  $v \cdot w = ||v|| ||w|| \cos(\theta)$
- 2. Orthogonality:  $v \cdot w = 0$
- 3. The zero vector is always orthogonal to any vector

**Remarque** (Why we can compute arccos). To find the angle, we can use arccos because we know that  $-1 \le \frac{v \cdot w}{||v||||w||} \le 1$  (Cauchy-Schwarz)

#### 8.1 problem

- 1. Proof for Angle between vectors
- 2. Find Angle between vectors
- 3. Algebraic Idea between Orthogonality using angle between vector
- 4. Determine if two vectors are orthogonal

# 9 Matrix Notation, Addition, and Scalar Multiplication

- 1. Matrix Addition
- 2. Properties of Matrix Addition
- 3. Scalar Multiplication
- 4. Properties of Scalar Multiplication

### 9.1 problem

- 1. Compute addition and scalar multiplication on matrices
- 2. Prove properties of matrix addition and multiplication
- 3. Use Matrix addition and scalar multiplication to compute

## 10 The Mechanics of Matrix Multiplication

- 1. Matrix Multiplication: row x columns
- 2. Properties of Matrix Multiplication
- 3. Why matrix multiplication is not commutative
- 4. Identity Matrix and Zero Matrix

## 10.1 problem

- 1. Compute the prduct of two matrices
- 2. Prove the properties of matrix multiplication
- 3. Multiplication by identity matrix and zero matrix

## 11 The Transpose of a Matrix

- 1. Transpose of Matrix: swap i and j
- 2. Properties of Transpose of Matrix
- $3. \ (AB)^T = B^T A^T$

#### 11.1 problem

- 1. Find transpose of matrix
- 2. Prove properties of transpose matrix

## 12 Powers of a Matrix

- 1. Matrix power:  $A^k = AA..A$
- 2. Properties of Matrix Power

- 1. Compute Matrix powers
- 2. Prove Properties of Matrix powers

### 13 Block Matrices

- 1. Block Matrices: partition of matrices for big matrice
- 2. Theorem: Matrix Vector Multiplication is a linear combination
- 3. Theorem: Matrix multiplication can be performed column-wise

## 13.1 problem

- 1. Perform Matrix Multiplication using Block Matrices
- 2. Proof for theorem using block multiplication

## 14 Introduction to Linear Transformations

- 1. Algebraic Definition of Linear Transformation
- 2. Geometric Definition of Linear Transformation
- 3. Linear Transformation using Standard Basis
- 4. Theorem: Every Linear Transformation T is completely determined by the vectors  $T(e_1), ..., T(e_n)$

### 14.1 problem

1. Determine if Matrix is a linear transformation algebraicly and geometrically

# 15 The Standard Matrix of a Linear Transformation

- 1. Theorem: Standard Matrix of a Linear Transformation: all linear transformation can be written as Ax=b
- 2. Standard Matrix of T: apply transformation to basis  $[T] = [T(e_1)...T(e_n)]$

- 1. Proof for Standard Matrix of Linear Transformation
- 2. Find standard matrix of linear transformation
- 3. Verification for standard matrix of linear transformation: Ax=b

## 16 A Catalog of Linear Transformations

- 1. Linear Tranformation of Zero and Identity Matrix
- 2. Diagonal Transformations/matrices
- 3. Projection onto a line
- 4. Rotations

## 16.1 problem

## 17 Composition of Linear Transformations

- 1. Theorem: Composition of Linear Transformation
  - Multiplication of Linear Tranformation is also linear
  - Computing composition of linear transformation as matrix multiplication

- 1. Proof of Composition of Linear Transformation
- 2. Computer Composition of Linear transformation using matrix multiplication

- 18 Introduction to Systems of Linear Equations
- 18.1 problem
- 19 Trichotomy for Linear Systems
- 19.1 problem
- 20 Solving Linear Systems (Part 1)
- 20.1 problem
- 21 Solving Linear Systems (Part 2: Row Echelon Form)
- 21.1 problem
- 22 Solving Linear Systems (Part 3: Zero and Infinitely Many Solutions)
- 22.1 problem

## 23 Elementary Matrices

Intuition. Building blocks of Matrices, like prime number are for integers

- 1. Theorem: row operations can be represented as matrices (from identity matrices)
- 2. Elementary Matrices: can be obtained from identity matrice via single row colum
- 3. Theorem: Row Reduction: [A|I] [R|E], where R=EA

### 23.1 problem

### 24 Introduction to the Inverse of a Matrix

**Intuition.** We can use elementary matrices to find the inverse of a matrix. We can undo our linear transformation

- 1. Inverse of a Matrix:  $A^-1A = AA^-1 = I$
- 2. Theorem: The inverse of a Matrix is unique
- 3. Properties of Matrix Inverses
- 4. How to know if Matrix is inversible

5. Theorem: Caracterization of Invertible Matrices

### 24.1 problem

- 1. Proof that inverse of a matrix is unique
- 2. Show that A is the inverse of B
- 3. Proof of Properties of Matrix Inverses
- 4. Zero Matrix and Projection Matrix are not inversible (we cannot undo ie we cannot find the original vector)
- 5. Determine if matrix is invertible or not: we can use row operations to get identity matrix

## 25 Computing the Inverse of a Matrix

1. Theorem: Computing Inverses: [A|I]  $[I|A^-1]$ 

### 25.1 problem

1. Determine if Matrix is invertible and find its inverse if it exists

## 26 One Sided Inverses and a Formula for 2x2 Inverses

- 1. Theorem: One-Sided Matrix Inverse: if AB=I or BA=I, then A is invertible and  $A^-1=B$
- 2. Theorem: Inverse of 2x2 Matrix:

**Intuition.** On dit que c'est one-sided parce qu'on a qu'à vérifier l'inégalité d'un seul bord pour dire que A et B sont leurs inverses respectifs

## 26.1 problem

- 1. Proof for One-Sided Matrix
- 2. Proof for 2x2 inverse matrices
- 3. Determine if 2x2 matrix is invertible and calculate its inverse if it exist

## 27 Subspaces

1. Definition of a Subspace

### 27.1 problem

1. Determine if set of vectors is a subspace of  $\mathbb{R}^n$ 

## 28 The Range and Null Space of a Matrix

1. Range of Matrix: Ax

2. Null Space: Ax = 0

3. Theorem: Range and Null space are subspace

### 28.1 problem

1. Find the range and the null space of the matrix

## 29 The Span of a Set of Vectors

1. Span:

2. Theorem: The span is the subspace of  $\mathbb{R}^n$ 

3. Theorem: Range equals the span of columns

4. Theorem: Spanning Sets and Invertible Matrices

## 29.1 problem

- 1. Show that set of vector span subspace
- 2. Proof
- 3. Proof

## 30 Linear Dependence and Independence

Intuition. Some vectors in the span are redundant

- 1. Linear Dependence and Independance
  - 2. Theorem:
- 3. Theorem: Independance and Invertible Matrices: If A is invertible, then its row and column are linearly independant

- 1. Determine if vectors are linearly dependant or not
- 2. Proofs

## 31 Bases of Subspaces

1. Defintion of Bases

## 31.1 problem

1. Determine if sets of vectors form a basis or not

## 32 The Dimension of a Subspace

- 1. Theorem: Uniqueness of Size of Bases: Every basis of S has the same number of vectors
- 2. Dimension of a Subspace

### 32.1 problem

## 33 The Rank of a Matrix

Intuition. How much information we have after transformation

- 1. Rank of the Matrix
- 2. Theorem: Charaterization of Rank

- 33.1 problem
- 34 The Nullity of a Matrix
- 34.1 problem
- 35 Introduction to the Determinant (Geometrically)
- 35.1 problem
- 36 Computing the Determinant (via Gaussian Elimination)
- 36.1 problem
- 37 Explicit Formulas for the Determinant
- 37.1 problem
- 38 Introduction to Eigenvalues and Eigenvectors
- 38.1 problem
- 39 Complex Numbers and Complex Eigenvalues
- 39.1 problem
- 40 The Characteristic Polynomial and Multiplicity
- 40.1 problem
- 41 Diagonalization and Large Matrix Powers
- 41.1 problem
- 42 Matrices with Distinct Eigenvalues are Diagonalizable
- 42.1 problem
- 43 The Fibonacci Sequence via Diagonalization
- 43.1 problem
- 44 Arbitrary Matrix Powers via Diagonalization
- 44.1 problem
- 45 Matrix Functions via Diagonalization
- 45.1 problem