# Math 254: Introduction to Linear Algebra

Notes #1.3 — Solutions of Linear systems; Matrix Algebra

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Spring 2022

(Revised: January 18, 2022)



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1.3. Linear Systems, Matrix Algebra

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Student Learning Objectives

SLOs: Solutions of Linear systems; Matrix Algebra

**SLOs 1.3** 

Solutions of Linear systems; Matrix Algebra

## After this lecture you should:

- Know what the Rank of a Matrix is; and its connection to total/leading/free variables and the number of solutions of a linear system
- Know the Fundamentals of:
  - Matrix-Vector algebra
  - Vector-Vector Dot Product / Inner Product
  - Matrix-Vector Product: Linear combinations



Outline

- Student Learning Objectives
  - SLOs: Solutions of Linear systems; Matrix Algebra
- 2 The Number of Solutions to a System of Linear Equations
  - Collecting the Results... and Adding More Language / Notation
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- Suggested Problems
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  - Lecture Book Roadmap
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1.3. Linear Systems, Matrix Algebra

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The Number of Solutions to a System of Linear Equations Definitions and Rules of Matrix Algebra Suggested Problems

Collecting the Results... and Adding More Language / Notation Mathematical Language: Logic Using Logic to Derive More Results Re: Variables and Rank

How Many Solutions Are There?!?

That's a good question; and it ties in with last lecture...

Let's ponder the three (augmented, eliminated) systems:

a. 
$$\begin{bmatrix} 1 & 2 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 \\ \hline 0 & 0 & 0 & 0 \end{bmatrix}$$
 b. 
$$\begin{bmatrix} 1 & 2 & 0 & 1 \\ 0 & 0 & 1 & 2 \\ \hline 0 & 0 & 0 & 0 \end{bmatrix}$$
 c. 
$$\begin{bmatrix} 1 & 0 & 0 & 1 \\ 0 & 1 & 0 & 2 \\ 0 & 0 & 1 & 3 \end{bmatrix}$$

b. 
$$\begin{bmatrix} 1 & 2 & 0 & 1 \\ 0 & 0 & 1 & 2 \\ \hline 0 & 0 & 0 & 0 \end{bmatrix}$$

c. 
$$\begin{bmatrix} 1 & 0 & 0 & 1 \\ 0 & 1 & 0 & 2 \\ 0 & 0 & 1 & 3 \end{bmatrix}$$

Where the leading coefficients have been circled in (red) Notice that in a, we did not circle the 1 in the third row, since it belongs to the right-hand-side (and NOT the coefficient matrix).



The Number of Solutions to a System of Linear Equations Definitions and Rules of Matrix Algebra

Collecting the Results... and Adding More Language / Notation Mathematical Language: Logic Suggested Problems

Using Logic to Derive More Results Re: Variables and Rank

System a. — No Solutions

"Move" non-leading variables to right-hand-side



right-hand-side constants

Here, the third row shows that there are **no solutions** to this system. We say that the system is inconsistent.



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System c. — One (Unique) Solutions

$$\begin{bmatrix} 1 & 0 & 0 & | & 1 \\ 0 & 1 & 0 & | & 2 \\ 0 & 0 & 1 & | & 3 \end{bmatrix} \quad \text{interpretation} \quad \begin{vmatrix} x_1 & = & 1 \\ x_2 & = & 2 \\ x_3 & = & 3 \end{vmatrix}$$

Here, there are no un-determined (free) variables; so there's only one solution.



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System b. — Infinitely Many Solutions

$$\begin{bmatrix} 1 & 2 & 0 & 1 \\ 0 & 0 & 1 & 2 \\ \hline 0 & 0 & 0 & 0 \end{bmatrix} \text{ interpretation } \begin{vmatrix} x_1 & = 1 - 2x_2 \\ x_3 & = 2 \\ 0 & = 0 \end{vmatrix}$$

We are left with one un-determined (free) variable; and introduce a parameter for  $x_2$  (let's pick the Greek letter  $\eta$  for fun), and write the infinitely many solutions as:

$$\left[\begin{array}{c} x_1 \\ x_2 \\ x_3 \end{array}\right] = \left[\begin{array}{c} 1-2\eta \\ \eta \\ 2 \end{array}\right] = \left[\begin{array}{c} 1 \\ 0 \\ 2 \end{array}\right] + \eta \left[\begin{array}{c} -\mathbf{2} \\ 1 \\ 0 \end{array}\right], \quad \text{where } \eta \in \mathbb{R} \Leftrightarrow \eta \in [-\infty, +\infty]$$



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Consistent vs. Inconsistent Linear Systems

Theorem (Number of Solutions of a Linear System)

A system of equations is said to be **consistent** if there is at least one solution; it is **inconsistent** if there are no solutions.

A linear system is inconsistent if and only if the reduced row-echelon form of its augmented matrix contains the row

$$[0\ 0\ 0\ 0\ 1],$$

representing the equation "0 = 1."

If a linear system is consistent, then it has either

- infinitely many solutions, if there is at least one free variable,
- exactly one solution, if all the variables are leading.



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Collecting the Results... and Adding More Language / Notation Mathematical Language: Logic

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Definitions

The Rank of a Matrix

Definition (The RANK of a Matrix)

Suggested Problems

The **rank** of a matrix is the number of leading 1s in rref(A) — the Reduced Row Echelon Form of A — and is denoted

rank(A).

Definition (Full RANK)

If  $A \in \mathbb{R}^{n \times n}$  (a square matrix of size n), and rank(A) = n, then the matrix is said to have **full rank**.

Heads-up! In terms of linear systems; the important rank is that of the coefficient matrix...



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Properties of the rank(A)

 $A \in \mathbb{R}^{n \times m}$ 

Property #2

If the system is inconsistent, then

rank(A) < n.

"Proof:" For an inconsistent matrix A, rref(A) will contain (at least) a row of the form  $\begin{bmatrix} 0 & 0 & 0 & 0 & 1 \end{bmatrix}$  — which does not have a leading one — so the rank can be at most (n-1).



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Properties of the rank(A)

Consider a matrix  $A \in \mathbb{R}^{n \times m}$ , corresponding to a linear system of n equations with *m* unknowns:

Property #1a, and #1b

The inequalities

 $rank(A) \le n$ , and  $rank(A) \le m$ 

hold.

"**Proof:**" If we transform A into ref(A), there is at most one leading 1 in each of the n rows (showing #1a); and there is at most one leading 1 in each of the m columns (showing #1b).



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Properties of the rank(A)

 $A \in \mathbb{R}^{n \times m}$ 

Property #3

If the system has exactly one solution, then

rank(A) = m.

"Proof:" A leading 1 for each variable leaves no free (un-determined) variables.

Property #4

If the system has infinitely many solutions, then

 $\operatorname{rank}(A) < m$ .

"Proof:" In this case, there's at least one free (un-determined) variable, which does not have a corresponding leading 1.



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Suggested Problems

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Properties of the rank(A)

It is true that (for  $A \in \mathbb{R}^{n \times m}$ )

#Free\_Variables = #Total\_Variables - #Leading\_Variables  $= m - \operatorname{rank}(A).$ 



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Using the Contrapositive

We have some true statements (for  $A \in \mathbb{R}^{n \times m}$ ):

- if the system is inconsistent, then rank(A) < n.
- if the system has exactly one solution, then rank(A) = m.
- if the system has infinitely many solutions, then rank(A) < m.

Using the contrapositive, we immediately can say that

if rank(A) = n, then **the system is consistent**.

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- if rank(A) < m, then the system has either no solutions, or infinitely many solutions.
- if rank(A) = m, then the system has no solutions, or exactly one solution.



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Using Logic to Derive More Results Re: Variables and Rank

More Mathematical Language: The Contrapositive

Definition (The Contrapositive of a Statement)

The contrapositive of a logic statement "if p then q", in math notation:  $p \to q$ ; is: "if not-q then not-p", notation:  $(\sim q) \to (\sim p)$ .

The contrapositive of

if 
$$\underbrace{you \text{ are in this room}}_p$$
 then  $\underbrace{you \text{ are in this building}}_q$ 

is

if 
$$\underbrace{\textit{you are not in this building}}_{(\sim q)}$$
 then  $\underbrace{\textit{you are not in this room}}_{(\sim p)}$ 

A statement and its contrapositive are logically equivalent; that is if the statement is true, then the contrapositive is true.



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Using Logic to Derive More Results Re: Variables and Rank

Additional Discussion

In all cases below,  $A \in \mathbb{R}^{n \times m}$ , rank $(A) < \min(n, m)$ .

**1** For an **inconsistent** system, there must be (as least) one row with zeros one the coefficient-side, and a non-zero on the right-hand-side:

at most 
$$n-1$$
 [  $\times$   $\cdots$   $\times$   $\times$  ]  $\times$  ] leading ones No leading one in this row [  $\times$   $\times$   $\times$   $\times$  ]  $\times$  ]

therefore, rank(A) < n.



Collecting the Results... and Adding More Language / Notation Mathematical Language: Logic

Using Logic to Derive More Results Re: Variables and Rank

#### Additional Discussion II

- When a system has **exactly one solution**, then rref(A) must have a leading one in each column (no free variables can remain). The number of columns (m) equals the number of variables; so we must have rank(A) = m. Note that therefore n > m — there can only be a single *leading one* in each row. We get two cases:
  - $(n = m) \Rightarrow \operatorname{rref}(A) = I_n$
  - $(n > m) \Rightarrow \text{Rows } (m+1) \text{ to } (n) \text{ must be all zeros, with zero}$ right-hand-side.
- When a system has infinitely many solutions, there is at least one free variable. Therefore rref(A) must have at least one column without a leading one, which means that  $rank(A) < (m-1). \Rightarrow rank(A) < m.$



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### Additional Discussion IV

When rank(A) < m, there is at least one column without a leading one  $\Rightarrow$  there is at least one free variable. Note that this does not rule out rows of the form

$$\begin{bmatrix} 0 & \cdots & 0 & 1 \end{bmatrix}$$
.

if such a row exists, the system is inconsistent and has no solutions, otherwise the system is consistent with (at least) one free variable, and has infinitely many solutions.

When rank(A) = m, there is a leading one in each column  $\Rightarrow$ there are no free variables. If there is a row of the form

$$\begin{bmatrix} 0 & \cdots & 0 & 1 \end{bmatrix}$$
.

the system is inconsistent and has no solutions, otherwise the system is consistent with a unique solution.



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Suggested Problems

Collecting the Results... and Adding More Language / Notation Mathematical Language: Logic Using Logic to Derive More Results Re: Variables and Rank

Additional Discussion III

Thinking about the contrapositive statements...

When rank(A) = n, there are leading ones in each row of the reduced system. Therefore, there cannot be any row of the form

$$\begin{bmatrix} 0 & \cdots & 0 & 1 \end{bmatrix}$$

which would indicate inconsistency. Hence, the system must be consistent. Again, we have two cases:

- $(m = n) \Rightarrow \operatorname{rref}(A) = I_n \Rightarrow$  the solution is unique.
- $(m > n) \Rightarrow$  there are (m n) free variables  $\Rightarrow$  there are infinitely many solutions.



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Collecting the Results... and Adding More Language / Notation Mathematical Language: Logic Using Logic to Derive More Results Re: Variables and Rank

The number of equations vs. the number of unknowns

Theorem (#Equations vs. #Unknowns)

- **statement**: If a linear system has exactly one solution, then there must be at least as many equations as there are variables; (m < n)using previous notation. [The coefficient matrix is either square, or "tall and skinny."]
- contrapositive: If a linear system has fewer equations than unknowns (n < m), then it either has no solutions or infinitely many **SOlutions.** [The coefficient matrix is "short and wide."]

Proof (of statement).

A system with exactly one solution has m = rank(A) [Property #3]; further rank(A)  $\leq n$  [Property #1A], therefore

$$m = \operatorname{rank}(A) \leq n$$

which shows  $(m \le n)$ .



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Square Matrices, and Their Reduced-Row-Echelon-Form

"Square" systems play a huge role in linear algebra:

Theorem (Systems of n Equations in n Variables)

A linear system of n equations (rows in the coefficient matrix) in n variables (columns in the coefficient matrix) has a unique solution if and only if the rank of the coefficient matrix A satisfies  $\operatorname{rank}(A) = n$ . When that is true the Reduced Row Echelon Form of A satisfies

$$\operatorname{rref}(A) = \begin{bmatrix} 1 & 0 & 0 & \cdots & 0 \\ 0 & 1 & 0 & \cdots & 0 \\ 0 & 0 & 1 & \cdots & 0 \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ 0 & 0 & 0 & \cdots & 1 \end{bmatrix}$$

that is rref(A) is the  $(n \times n)$  identity matrix, usually denoted  $I_n$ .



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The Number of Solutions to a System of Linear Equations

Definitions and Rules of Matrix Algebra

Suggested Problems

Fundamentals of Matrix and Vector Algebra

Fundamentals of Matrix and Vector Algebra

Dot Product

Definition (Dot Product of Vectors)

Consider two vectors  $\vec{v}$ , and  $\vec{w}$ , both with n components (that is  $v_1, v_2, \ldots, v_n$  and  $w_1, w_2, \ldots, w_n$ ). The **dot product** is defined as the sum of the element-wise products:

$$\vec{v} \cdot \vec{w} = v_1 w_1 + v_2 w_2 + \dots + v_n w_n = \sum_{k=1}^n v_k w_k$$

**Note:** The way we have defined the *dot product* it is not row/column sensitive. However if you stick with the standard notation that "vectors" are column-vectors, it is common to see the equivalent notation:

$$\vec{v}^T \vec{w} \equiv \vec{v} \cdot \vec{w} = v_1 w_1 + v_2 w_2 + \dots + v_n w_n = \sum_{k=1}^n v_k w_k.$$

A common alternative name for the dot product, is the **inner product**.



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The Number of Solutions to a System of Linear Equations

Definitions and Rules of Matrix Algebra

Suggested Problems

Fundamentals of Matrix and Vector Algebra

Fundamentals of Matrix and Vector Algebra

We now define ways that our Matrix and Vector objects can "interact"; we are adding some "verbs" to our Mathematical language!

Definition (Matrix Sums)

The sum of two matrices of the same size  $A, B \in \mathbb{R}^{n \times m}$  is determined by the entry-by-entry sums, that is if

$$C = A + B$$

then  $C \in \mathbb{R}^{n \times m}$ , and  $c_{ij} = a_{ij} + b_{ij}$  for  $i \in [1, \dots, n]$ ,  $j \in [1, \dots, m]$ .

Definition (Scalar Multiple of a Matrix)

If  $A \in \mathbb{R}^{n \times m}$  is a matrix, and  $\rho \in \mathbb{R}$  is a real scalar, then the scalar-matrix-product

$$C = \rho A$$

gives  $C \in \mathbb{R}^{n \times m}$ , and  $c_{ij} = \rho a_{ij}$ .



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1.3. Linear Systems, Matrix Algebra

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The Number of Solutions to a System of Linear Equations

Definitions and Rules of Matrix Algebra

Suggested Problems

Fundamentals of Matrix and Vector Algebra

Fundamentals of Matrix and Vector Algebra

Matrix-Vector Product

Definition (Matrix-Vector Product)

If  $A \in \mathbb{R}^{n \times m}$  matrix with row-vectors  $\vec{r}_1^T, \dots, \vec{r}_n^T \in \mathbb{R}^m$ , and  $\vec{x} \in \mathbb{R}^m$  is a (column) vector, then

$$A\vec{x} = \begin{bmatrix} - & \vec{r}_1^T & - \\ & \vdots & \\ - & \vec{r}_n^T & - \end{bmatrix} \vec{x} = \underbrace{\begin{bmatrix} \vec{r}_1^T \vec{x} \\ \vdots \\ \vec{r}_n^T \vec{x} \end{bmatrix}}_{\text{Using Inner Product Notation}} \equiv \underbrace{\begin{bmatrix} \vec{r}_1^T \cdot \vec{x} \\ \vdots \\ \vec{r}_n^T \cdot \vec{x} \end{bmatrix}}_{\text{Using Dot Product Notation}}$$

The  $i^{\text{th}}$  component of the resulting vector  $\vec{y} = A\vec{x}$  is given by the dot (inner) product of the  $i^{\text{th}}$  row of A and the vector  $\vec{x}$ . Note that if  $m \neq n$  then  $\vec{y} \in \mathbb{R}^n$  is not the same size as  $\vec{x} \in \mathbb{R}^m$ .



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For the matrix-vector product to make sense, the matrix  $A \in \mathbb{R}^{n \times m}$  and the vector  $\vec{x} \in \mathbb{R}^{m} \equiv \mathbb{R}^{m \times 1}$  must have compatible sizes:

$$\underbrace{A}_{[n \times m]}\underbrace{\vec{x}}_{[m \times 1]} = \underbrace{\vec{y}}_{[n \times 1]}$$

Looking Ahead (Matrix Multiplication): thinking about size, it's probably OK to multiply  $A \in \mathbb{R}^{n \times m}$  and  $B \in \mathbb{R}^{m \times p}$ ; a solid "guess" for the size of the result? —

$$\underbrace{A}_{[n \times m]} \underbrace{B}_{[m \times p]} = \underbrace{C}_{[n \times p]}$$

however the product BA does not make sense (unless n = p).

We will formally define Matrix-Matrix products in [Notes#3.3].



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The Number of Solutions to a System of Linear Equations Definitions and Rules of Matrix Algebra Suggested Problems

Fundamentals of Matrix and Vector Algebra

Thinking about  $A\vec{x}$  as the Linear Combination of the Columns

Theorem (The Product  $A\vec{x}$  in Terms of the Columns of A)

If the column vectors of an  $n \times m$  matrix A are  $\vec{v}_1, \ldots, \vec{v}_m$  and  $\vec{x} \in \mathbb{R}^m$ with components  $x_1, \ldots, x_m$ , then

$$A\vec{x} = \begin{bmatrix} & | & & | \\ \vec{v}_1 & \dots & \vec{v}_m \\ | & & | \end{bmatrix} \begin{bmatrix} x_1 \\ \vdots \\ x_m \end{bmatrix} = x_1\vec{v}_1 + \dots + x_m\vec{v}_m.$$

Definition (Linear Combinations)

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A vector  $\vec{b}$  in  $\mathbb{R}^n$  is called a **linear combination** of the vectors  $\vec{v}_1, \dots, \vec{v}_m$  $\in \mathbb{R}^n$  if there exists scalars  $x_1, \ldots, x_m$  such that

$$\vec{b} = x_1 \vec{v}_1 + \dots x_m \vec{v}_m.$$



The Number of Solutions to a System of Linear Equations Definitions and Rules of Matrix Algebra Suggested Problems

Fundamentals of Matrix and Vector Algebra

Thinking About  $A\vec{x}$  in a Different Way

So far, we have thought of the components of  $A\vec{x}$  as the result of dot-products of the rows of A and the vector  $\vec{x}$ ; to inspire a different view:

Consider  $A \in \mathbb{R}^{2\times 3}$  and  $\vec{x} \in \mathbb{R}^3$ , then

$$A\vec{x} = \begin{bmatrix} a_{11} & a_{12} & a_{13} \\ a_{21} & a_{22} & a_{23} \end{bmatrix} \begin{bmatrix} x_1 \\ x_2 \\ x_3 \end{bmatrix} = \begin{bmatrix} a_{11}x_1 + a_{12}x_2 + a_{13}x_3 \\ a_{21}x_1 + a_{22}x_2 + a_{23}x_3 \end{bmatrix}$$

We realize that

$$\begin{bmatrix} a_{11}X_1 + a_{12}X_2 + a_{13}X_3 \\ a_{21}X_1 + a_{22}X_2 + a_{23}X_3 \end{bmatrix} = X_1 \begin{bmatrix} a_{11} \\ a_{21} \end{bmatrix} + X_2 \begin{bmatrix} a_{12} \\ a_{22} \end{bmatrix} + X_3 \begin{bmatrix} a_{13} \\ a_{23} \end{bmatrix}$$

Which means that we can think of  $\vec{y} = A\vec{x}$  as a sum of vectors (where the vectors are the columns of A, scaled by the components of  $\vec{x}$ )



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The Number of Solutions to a System of Linear Equations Definitions and Rules of Matrix Algebra Suggested Problems

Fundamentals of Matrix and Vector Algebra

Challenge Question

Think, again, about the linear systems:

Let  $A_a \in \mathbb{R}^{4 \times 3}$ ,  $A_b \in \mathbb{R}^{3 \times 3}$ ,  $A_c \in \mathbb{R}^{3 \times 3}$  be the coefficient matrices; and  $\vec{b}_a \in \mathbb{R}^4$ ,  $\vec{b}_b, \vec{b}_c \in \mathbb{R}^3$  be the right-hand-sides. We are seeking solutions  $\vec{x}_a, \vec{x}_b, \vec{x}_c \in \mathbb{R}^3$ , so that  $A_{a}\vec{x}_{a} = \vec{b}_{a}, A_{b}\vec{x}_{b} = \vec{b}_{b}, A_{c}\vec{x}_{c} = \vec{b}_{c}.$ 

If we think of the matrix-vector products as linear combinations of the columns; how can we characterize the 3 possible scenarios (no,  $\infty$ , 1) solutions?

Does the rank have anything to do with it?

This will be answered very soon, but do think about it...



The Number of Solutions to a System of Linear Equations Definitions and Rules of Matrix Algebra Suggested Problems

Fundamentals of Matrix and Vector Algebra

Two More Theorems...

Theorem (Algebraic Rules for  $A\vec{x}$ )

If  $A \in \mathbb{R}^{n \times m}$ ,  $\vec{x} \in \mathbb{R}^m$ ,  $\vec{y} \in \mathbb{R}^m$ , and  $k \in \mathbb{R}$ , then

- $A(\vec{x} + \vec{y}) = A\vec{x} + A\vec{y}$
- $A(k\vec{x}) = k(A\vec{x})$

Theorem (Matrix Form of Linear System)

We can write the linear system with Augmented Matrix  $\begin{vmatrix} A & \vec{b} \end{vmatrix}$  in matrix-vector form as

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



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The Number of Solutions to a System of Linear Equations Definitions and Rules of Matrix Algebra Suggested Problems

Suggested Problems 1.3 Lecture - Book Roadmap

## Lecture – Book Roadmap

Lecture	Book, [GS5-]
1.1	§2.2
1.2	§1.1, §1.3, §2.1, §2.3
1.3	§1.1, §1.2, §1.3, §2.1, §2.3

The Number of Solutions to a System of Linear Equations Definitions and Rules of Matrix Algebra Suggested Problems

Suggested Problems 1.3 Lecture - Book Roadman

Suggested Problems 1.3

## **Available on "Learning Glass" videos:**

- **1.3.1** Given rref, how many solutions does each system have?
- **1.3.2** Find the rank of a matrix.
- **1.3.3** Find the rank of a matrix.
- **1.3.7** How many solutions? (Geometrical argument).
- 1.3.13 Compute matrix-vector product.
- **1.3.22** Given a system + properties of the solution; what is the form of rref(A)?
- **1.3.23** Given a system + properties of the solution; what is the form of
- **1.3.37** Find all solutions of  $A\vec{x} = \vec{b}$ .
- **1.3.46** Find rank(A).
- **1.3.55** Is a given vector a linear combination of two other vectors?

Supplemental Material



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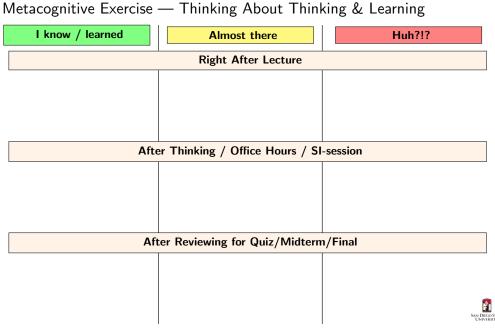
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Metacognitive Reflection

**Problem Statements 1.3** 

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Metacognitive Exercise — Thinking About Thinking & Learning





(1.3.1)

(1.3.1) The reduced-row-echelon-forms (RREF) of the augmented matrices of three systems are given. How many solutions does each system have?

(a) 
$$\begin{bmatrix} 1 & 0 & 2 & 0 \\ 0 & 1 & 3 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$
, (b)  $\begin{bmatrix} 1 & 0 & 5 \\ 0 & 1 & 6 \end{bmatrix}$ , (c)  $\begin{bmatrix} 0 & 1 & 0 & 2 \\ 0 & 0 & 1 & 3 \end{bmatrix}$ .



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1.3. Linear Systems, Matrix Algebra

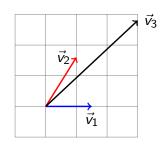
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Supplemental Material

Metacognitive Reflection **Problem Statements 1.3** 

(1.3.7)

(1.3.7) Consider the vectors  $\bar{\mathbf{v}}_1$ ,  $\bar{\mathbf{v}}_2$ ,  $\bar{\mathbf{v}}_3 \in \mathbb{R}^2$ :



How many solutions x, y does the system

$$x\overline{\mathbf{v}}_1 + y\overline{\mathbf{v}}_2 = \overline{\mathbf{v}}_3$$

have? Argue geometrically.



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(1.3.2) Find the rank of

(1.3.2), (1.3.3)

$$A = \left[ \begin{array}{rrr} 1 & 2 & 3 \\ 0 & 1 & 2 \\ 0 & 0 & 1 \end{array} \right]$$

(1.3.3) Find the rank of

$$A = \left[ \begin{array}{ccc} 1 & 1 & 1 \\ 1 & 1 & 1 \\ 1 & 1 & 1 \end{array} \right]$$

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Supplemental Material

Metacognitive Reflection **Problem Statements 1.3** 

(1.3.13), (1.3.22), (1.3.23)

(1.3.13) Compute the matrix-vector product  $A\bar{\mathbf{x}}$ , where

$$A = \begin{bmatrix} 1 & 2 \\ 3 & 4 \end{bmatrix} \quad \vec{x} = \begin{bmatrix} 7 \\ 11 \end{bmatrix}.$$

(1.3.22) Consider a linear system of 3 equations with 3 unknowns,  $A\bar{\mathbf{x}} = \bar{\mathbf{b}}$ . GIVEN: This system has a unique solution. What does the reduced-row-echelon-form of the coefficient matrix, rref(A) of this system look like?

(1.3.23) Consider a linear system of 4 equations with 3 unknowns,  $A\bar{\mathbf{x}} = \mathbf{b}$ . GIVEN: This system has a unique solution. What does the reduced-row-echelon-form of the coefficient matrix, rref(A) of this system look like?



Supplemental Material

Metacognitive Reflection Problem Statements 1.3

(1.3.37), (1.3.46)

(1.3.37) Find all vectors  $\vec{x}$  such that  $A\vec{x} = \vec{b}$ , where

$$A = egin{bmatrix} 1 & 2 & 0 \ 0 & 0 & 1 \ 0 & 0 & 0 \end{bmatrix}, \quad \vec{b} = egin{bmatrix} 2 \ 1 \ 0 \end{bmatrix}.$$

(1.3.46) Find the rank of the matrix

$$A = \begin{bmatrix} a & b & c \\ 0 & d & e \\ 0 & 0 & f \end{bmatrix},$$

where  $a, d, f \neq 0$ ; and  $b, c, e \in \mathbb{R}^n$  are arbitrary numbers.



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(1.3.55) Is the vector

(1.3.55)

a linear combination of the vectors

$$\begin{bmatrix} 1 \\ 2 \\ 3 \end{bmatrix}, \quad \text{and} \quad \begin{bmatrix} 4 \\ 5 \\ 6 \end{bmatrix}$$



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