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Title	Matrix Algebra, Basics of	
Author	Degree	
	Given Name	Ayman
	Particle	
	Family Name	Badawi
	Suffix	
	Phone	
	Fax	
	Email	abadawi@aus.edu
Affiliation	Division	Department of Mathematics
	Organization	American University of Sharjah
	Street	Box 26666
	City	Sharjah
	Country	UAE

CORRECTED PROOF

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<p>1</p> <p>2 Matrix Algebra, Basics of</p> <p>3 Ayman Badawi</p> <p>4 Department of Mathematics, American</p> <p>5 University of Sharjah, Sharjah, UAE</p> <p>6 Synonyms</p> <p>7 Addition and subtraction of matrices; Augmented</p> <p>8 matrix; Consistent and inconsistent system;</p> <p>9 Cramer rule; Determinant of a matrix; Echelon</p> <p>10 form; Elementary matrix; Invertible (nonsin-</p> <p>11 gular) matrices; Multiplication of matrices;</p> <p>12 Symmetric and skew-symmetric matrices;</p> <p>13 Transpose of a matrix</p> <p>14 Glossary</p> <p>15 Matrix $n \times m$ A matrix is a block consisting of</p> <p>16 n row and m column. An entry in a matrix B</p> <p>17 located in the ith row and jth column of B is</p> <p>18 denoted by b_{ij}</p> <p>19 Consistent and Inconsistent System of Linear</p> <p>20 Equations A system of linear equations is</p> <p>21 said to be consistent if it has a solution, and</p> <p>22 it is called inconsistent if it has no solutions</p> <p>23 Augmented Matrix An augmented matrix of a</p> <p>24 system of linear equations written in matrix-</p> <p>25 form $CX = B$ is a matrix of the form $[C B]$,</p> <p>26 where C is the coefficient matrix of the system</p> <p>27 and B is the constant column of the system</p>	<p>Transpose of a Matrix The transpose of a ma- 28 trix A is denoted by A^T such that $a_{ij}^T = a_{ji}$ 29</p> <p>Symmetric Matrix and Skew-Symmetric 30 Matrix A square matrix A, $n \times n$, is said 31 to be symmetric if $A^T = A$, and it is called a 32 skew-symmetric if $A^T = -A$ 33</p> <p>Identity Matrix I_n Let $n \geq 2$ be a positive 34 integer. Then $B = I_n$ is the square matrix, 35 $n \times n$, where $b_{ij} = 1$ if $i = j$ and $b_{ij} = 0$ if 36 $i \neq j$ If A is an $n \times m$ matrix, then $AI_m = A$ 37 and $I_n A = A$. 38</p> <p>Elementary Matrix An elementary matrix is a 39 matrix which differs from the identity matrix 40 (I_n) by one single elementary row operation 41</p> <p>Equivalent Matrices Two matrices are equiv- 42 alent if each is obtained from the other by 43 applying a sequence of row operations 44</p> <p>Invertible (Nonsingular) Matrix A square ma- 45 trix A, $n \times n$, is said to be invertible or nonsin- 46 gular if there exists a matrix $n \times n$ denoted by 47 A^{-1} such that $AA^{-1} = A^{-1}A = I_n$ 48</p> <p>Determinant of a Matrix The determinant is a 49 value associated with a square matrix. It can 50 be computed from the entries of the matrix by 51 a specific arithmetic expression, while other 52 ways to determine its value exist as well. 53 Determinants occur throughout mathematics. 54 The use of determinants in calculus includes 55 the Jacobian determinant in the substitution 56 rule for integrals of functions of several vari- 57 ables. They are used to define the characteris- 58 tic polynomial of a matrix that is an essential 59 tool in eigenvalue problems in linear algebra 60</p>
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61 **Cramer Rule** Cramer's rule is an explicit
 62 formula for the solution of a system of
 63 linear equations with as many equations as
 64 unknowns, valid whenever the system has
 65 a unique solution. It expresses the solution
 66 in terms of the determinants of the (square)
 67 coefficient matrix and of matrices obtained
 68 from it by replacing one column by the
 69 constant column of right hand sides of the
 70 equations. It is named after Gabriel Cramer
 71 (1704–1752)

72 Definition

73 In this entry, we describe all basic matrix oper-
 74 ations: Addition, subtraction, and multiplication.
 75 We show the importance of matrices in studying
 76 system of linear equations (augmented matrix
 77 and row operations). We show different meth-
 78 ods used in calculating determinant of a square
 79 matrix. We show the importance of determinant
 80 in solving system of linear equations (Cramer
 81 rule) and in finding the inverse of a matrix (Ad-
 82 joint method).

83 Introduction

84 Graphs are very useful ways of presenting
 85 information about social networks. However,
 86 when there are many actors and/or many kinds
 87 of relations, they can become so visually
 88 complicated that it is very difficult to see patterns.
 89 It is also possible to represent information
 90 about social networks in the form of matrices.
 91 Representing the information in this way also
 92 allows the application of mathematical and
 93 computer tools to summarize and find patterns.
 94 Social network analysts use matrices in a number
 95 of different ways. So, understanding a few
 96 basic things about matrices from mathematics
 97 is necessary. For example, the simplest and most
 98 common matrix is binary. That is, if a tie is
 99 present, a one is entered in a cell; if there is no
 100 tie, a zero is entered. This kind of a matrix is
 101 the starting point for almost all network analysis
 102 and is called an “adjacency matrix” because it

represents who is next to or adjacent to whom in
 the “social space” mapped by the relations that
 we have measured. The following is an example
 of a binary matrix:

$$\begin{bmatrix} 0 & 1 & 1 \\ 0 & 0 & 1 \\ 0 & 1 & 0 \end{bmatrix} \quad 107$$

Matrices and linear algebra are surely inseparable
 subjects, and they are important “concepts”
 needed in many aspects of real life science.
 The subject of linear algebra can be partially
 explained by the meaning of the two terms
 comprising the title. We can understand “linear”
 to mean anything that is “straight” or “flat”.
 For example, in the xy -plane we are accustomed to
 describing straight lines as the set of solutions
 to an equation of the form $y = mx + b$,
 where the slope m and the y -intercept b are
 constants that together describe the line. Living
 in three dimensions, with coordinates described
 by triples (x, y, z) , they can be described as
 the set of solutions to equations of the form
 $ax + by + cz = d$, where a, b, c, d are con-
 stants that together determine the plane. While
 we might describe planes as “flat”, lines in three
 dimensions might be described as “straight”.
 From a multivariate calculus course, we recall
 that lines are sets of points described by equations
 such as $x = 3t - 4$, $y = -7t + 2$, $z = 9t$, where
 t is a parameter that can take on any value.

Another view of this notion of “flatness” is to
 recognize that the sets of points just described are
 solutions to equations of a relatively simple form.
 These equations involve addition and multipli-
 cation only. Here are some examples of typical
 equations:

$$2x + 3y - 4z = 134$$

$$x_1 + 5x_2 - x_3 + x_4 + x_5 = 0$$

$$9a - 2b + 7c + 2d = -7$$

What we will not see in a linear algebra course
 are equations like:

$$xy + 5yz = 13x_1 + x_2^3/x_4 - x_3x_4x_5^2 = 0$$

$$\cos(ab) + \log(c - d) = -2$$

139 A system of linear equations in several un-
 140 knowns is naturally represented using the formal-
 141 ism of matrices.

142 The word “algebra” is used frequently in
 143 mathematical preparation courses. Most likely,
 144 we have spent a good 10–15 years learning
 145 the algebra of the real numbers, along with
 146 some introduction to the very similar algebra
 147 of complex numbers. However, there are many
 148 new algebras to learn and use, and likely, linear
 149 algebra and matrix operations will be our second
 150 algebra. Like learning a second language, the
 151 necessary adjustments can be challenging at
 152 times, but the rewards are many. And it will
 153 make learning our third and fourth algebras
 154 even easier. Perhaps, “groups” and “rings” are
 155 excellent examples of other algebras with very
 156 interesting properties and applications.

157 The brief discussion above about lines and
 158 planes suggests that linear algebra has an inher-
 159 ently geometric nature, and this is true. Examples
 160 in two and three dimensions can be used to
 161 provide valuable insight into important concepts
 162 of this subject.

163 The material presented here can be found in
 164 every textbook on basic linear algebra. Since
 165 there are so many textbooks on basic linear
 166 algebra, and we cannot list all of them, we
 167 refer to a few books here. For example, Axler
 168 (1997), Bernstein (2005), Beezer (2004), Blyth
 169 and Robertson (2002), Kaw (2011), Lang (1986),
 170 Lay (2003), Robbiano (2011), and Shores (2007).

171 System of Linear Equations

172 Matrices play an important role in solving a
 173 system of linear equations as we will see later on
 174 in this section. Let R be the set of all real numbers
 175 and C be the set of all complex numbers. Then
 176 $R^n = \{(a_1, a_2, \dots, a_n) \mid a_1, a_2, \dots, a_n \in R\}$
 177 and $C^n = \{(a_1, a_2, \dots, a_n) \mid a_1, a_2, \dots, a_n \in C\}$.
 178 An element of R^n (C^n) is called a point.

179 A system of linear equations is a collection of
 180 m equations with n variable $x_1, x_2, x_3, \dots, x_n$ of
 181 the form

$$\begin{aligned} a_{11}x_1 + a_{12}x_2 + a_{13}x_3 + \dots + a_{1n}x_n &= b_1 \\ a_{21}x_1 + a_{22}x_2 + a_{23}x_3 + \dots + a_{2n}x_n &= b_2 \\ a_{31}x_1 + a_{32}x_2 + a_{33}x_3 + \dots + a_{3n}x_n &= b_3 \\ &\vdots \\ a_{m1}x_1 + a_{m2}x_2 + a_{m3}x_3 + \dots + a_{mn}x_n &= b_m \end{aligned} \tag{1}$$

where $a_{ij}, b_j \in R$ ($\in C$). 182

A point $(a_1, \dots, a_n) \in R^n$ ($\in C^n$) is said 183
 to be a solution to a system of linear equations 184
 with n variables, $x_1, x_2, x_3, \dots, x_n$ as in (1) if 185
 we substitute a_1 for x_1 , a_2 for x_2 , a_3 for x_3 , \dots , 186
 a_n for x_n ; then, for every equation of the system 187
 the left side will equal the right side, i.e., each 188
 equation is true simultaneously. 189

Let F be a set. Then $|F|$ denotes the cardinal- 190
 ity of the set F , i.e., the number of the elements 191
 in F . 192

Theorem 1 Let $F \subseteq R^n$ ($\subseteq C^n$) be the set of all 193
 solutions to a system of linear equations with n 194
 variables. Then either $|F| = 1$ (i.e., the system 195
 has unique solution) or F is an empty set (i.e., 196
 the system has no solution) or $|F| = \infty$ (i.e., the 197
 system has infinitely many solutions). 198

Example 1 $F = \{(2, 1)\}$ is the set of all solu- 199
 tions to the system $2x_1 + x_2 = 5$, $x_1 + 2x_2 = 4$ 200
 (i.e., $x_1 = 2$, $x_2 = 1$, and hence, the solution is 201
 unique). 202

$F = \{(a_1, 2a_1 + 3) \mid a_1 \in R\}$ is the set 203
 of all solutions to the system $-2x_1 + x_2 = 3$, 204
 $-4x_1 + 2x_2 = 6$ (i.e., the system has infinitely 205
 many solutions). 206

The system $x_1 + 2x_2 = 0$, $2x_1 + 4x_2 = 1$ has no 207
 solutions. 208

A system of linear equations is called **consistent** 209
 if it has a solution, and it is called **inconsistent** if 210
 it has no solutions. A system of linear equations 211
 as in (1) is called **homogeneous** if $b_1 = b_2 =$ 212
 $\dots = b_m = 0$. 213

Theorem 2 Every homogeneous system of linear 214
 equations is consistent (i.e., $(0, 0, \dots, 0)$ is always 215
 a solution of such system). If a system of linear 216
 equations is consistent and it has more variables 217
 than equations, then the system has infinitely 218

219 many solutions. In particular, if a homogenous
 220 system has more variables than equations, then
 221 it has infinitely many solutions.

222 Two systems of linear equations are **equivalent** if
 223 their solution sets are equal.

224 **Theorem 3** If we apply one or two or all of
 225 the following equation operations to a system of
 226 linear equations as many times as we want, then
 227 the original system and the transformed system
 228 are equivalent.

- 229 1. Swap the locations of two equations in the list
 230 of equations.
- 231 2. Multiply each term of an equation by a
 232 nonzero quantity.
- 233 3. Multiply each term of one equation by some
 234 quantity and add these terms to a second
 235 equation, on both sides of the equality. Leave
 236 the first equation the same after this operation
 237 but replace the second equation by the new
 238 one.

239 In light of **Theorem 3**, one can view each equation
 240 of a system of linear equations as a row of a
 241 matrix and each equation operation in **Theorem 3**
 242 as a row operation on a matrix. Hence, we have
 243 the following well-known **row operations**.

244 Let A be an $m \times n$ matrix (i.e., A has m rows
 245 and n columns). Then each of the following is
 246 called a row operation on A .

- 247 1. Swap the locations of two rows.
- 248 2. Multiply each entry of a single row by a
 249 nonzero quantity.
- 250 3. Multiply each entry of one row by some quan-
 251 tity and add these values to the entries in the
 252 same columns of a second row. Leave the first
 253 row the same after this operation but replace
 254 the second row by the new values.

255 We will use the following notations to describe
 256 the row operations stated above:

- 257 1. $R_i \leftrightarrow R_j$: Swap the location of rows i and j .
- 258 2. αR_i : Multiply row i by the nonzero scalar α .
- 259 3. $\alpha R_i + R_j \rightarrow R_j$: Multiply row i by the scalar
 260 α and add to row j , so that row j will change
 261 but no change in row i .

262 Two matrices, A, B , of the same size, say $m \times n$,
 263 are said to be **row-equivalent** if and only if A is
 264 obtained from B by applying a sequence of row
 265 operations on B .

The following type of matrices is needed in 266
 order to achieve our main goal and solve a system 267
 of linear equations using augmented matrices. 268

A matrix $A, m \times n$, is called in **reduced row-** 269
echelon form if it meets all of the following 270
 conditions: 271

- 272 1. If there is a row where every entry is zero, then
 273 this row lies below any other row that contains
 274 a nonzero entry.
- 275 2. The leftmost nonzero entry of a row is equal
 276 to 1.
- 277 3. The leftmost nonzero entry of a row is the only
 278 nonzero entry in its column.
- 279 4. Consider any two different leftmost nonzero
 280 entries, one located in row i , column j and
 281 the other located in row s , column t . If $s > i$,
 282 then $t > j$.

A matrix $A, m \times n$, is said to be in **row-echelon** 283
form if and only if A satisfies conditions (1), (2), 284
 and (4) as above. 285

Example 2 The matrix $A = \begin{bmatrix} 0 & 1 & 3 & 0 & 0 \\ 0 & 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 0 & 1 \end{bmatrix}$ is in 286
 reduced row-echelon form. 287

The matrix $A = \begin{bmatrix} 1 & 1 & 1 & 1 \\ 0 & 0 & 1 & 4 \\ 0 & 0 & 0 & 1 \end{bmatrix}$ is in row-echelon 288
 form but not in reduced row-echelon form. 289

The matrix $A = \begin{bmatrix} 0 & 1 \\ 1 & 0 \end{bmatrix}$ is neither in row-echelon 290
 form nor in reduced row-echelon form. 291

Theorem 4 Let A be a matrix, $m \times n$. Then A 292
 is row-equivalent to a unique matrix, $m \times n$, in 293
 reduced row-echelon form. 294

Consider the system in (1). The augmented
 matrix of the system is

$$\left[\begin{array}{cccc|c} a_{11} & a_{12} & \cdots & a_{1n} & b_1 \\ a_{21} & a_{22} & \cdots & a_{2n} & b_2 \\ \vdots & \vdots & \cdots & \vdots & \vdots \\ a_{m1} & a_{m2} & \cdots & a_{mn} & b_m \end{array} \right]$$

where $a_{1i}, a_{2i}, \dots, a_{mi}$ are the coefficients of 295
 the variable x_i in the system (1). In view of 296
Theorem 3, we have the following result. 297

298 **Theorem 5** Let A be the augmented matrix of a
 299 given system of linear equations and let E be the
 300 reduced row-echelon form of A . Then the solution
 301 set of the given system is equal to the solution set
 302 of the system that has E as its augmented matrix.

303 **Theorem 6** Let A be the augmented matrix of a
 304 given system of linear equations and let E be the
 305 reduced row-echelon form of A . Then the given
 306 system is consistent if and only if none of the
 307 equations that correspond to the matrix E has a
 308 form zero = nonzero.

309 Suppose A is the augmented matrix of a consis-
 310 tent system of linear equations and let E be the
 311 reduced row-echelon form of A . Suppose j is the
 312 index of a column of B that contains the leading
 313 1 for some row. Then the variable x_j is said to
 314 be **dependent or leading**. A variable that is not
 315 dependent is called **independent or free**. If x_k is
 316 an independent variable, we understand that x_k
 317 can take any real (complex) value.

318 Consider the following system:

$$\begin{aligned} 319 \quad & x_1 + 2x_2 - x_3 + 2x_4 = 1 \\ 320 \quad & \\ 321 \quad & -2x_1 - 4x_2 + 3x_3 - 4x_4 = 2 \\ 322 \quad & \\ 323 \quad & -x_1 - 2x_2 + x_3 - 2x_4 = -1 \end{aligned}$$

324 Whose augmented matrix is equivalent to the
 325 matrix

$$326 \quad E = \begin{bmatrix} 1 & 2 & 0 & 2 & | & 5 \\ 0 & 0 & 1 & 0 & | & 4 \\ 0 & 0 & 0 & 0 & | & 0 \end{bmatrix}$$

327 in reduced row-echelon form, which corresponds
 328 to the system:

$$\begin{aligned} & x_1 + 2x_2 + 2x_4 = 5 \\ & x_3 = 4 \\ & 0 = 0 \end{aligned}$$

329 No equation of this system has a form zero =
 330 nonzero. Therefore, the original system is con-
 331 sistent. The dependent (leading) variables are x_1
 332 and x_3 . The independent (free) variables are x_2
 333 and x_4 . Thus, x_2, x_4 can take any real (complex)
 334 values. We write the leading variables in terms of
 335 the dependent variables. Thus, we have:

$$\begin{aligned} x_1 &= 5 - 2x_2 - 2x_4 \\ x_3 &= 4 \\ x_2, x_4 &\in R(C) \end{aligned}$$

Hence, the solution set of the original sys- 336
 tem is 337

$$F = \{(5 - 2x_2 - 2x_4, x_2, 4, x_4) \mid x_2, x_4 \in R(C)\}. \quad 338$$

Matrix Operations 339

Let $M_{n \times m}$ be the set of all $n \times m$ matrices with 340
 entries from $R(C)$ for some positive integers 341
 n, m . If $A \in M_{n \times m}$, then a_{ij} denotes the entry 342
 in the matrix A that is located in the i th row and 343
 the j th column of A . If $A \in M_{n \times m}$, then we say 344
 that $size(A) = n \times m$. 345

**Theorem 7 (Addition, subtraction, and multi- 346
 plication by a scalar)** Let A, B be two matrices 347
 and $\alpha \in R(C)$. Then $A + B$ and $A - B$ is defined 348
 if and only if $size(A) = size(B)$. Furthermore, 349
 suppose that $size(A) = size(B)$, $A + B = C$, 350
 $A - B = D$, and $\alpha A = F$. Then $c_{ij} = a_{ij} + b_{ij}$, 351
 $d_{ij} = a_{ij} - b_{ij}$, and $f_{ij} = \alpha a_{ij}$. 352

Example 3 Let $A = \begin{bmatrix} 3 & 4 & 1 \\ -1 & 0 & 2 \end{bmatrix}$, $B = \begin{bmatrix} -2 & 0 & 1 \\ 4 & -2 & 1 \end{bmatrix}$, and $\alpha = -2$. Then $A + B = \begin{bmatrix} 1 & 4 & 2 \\ 3 & -2 & 3 \end{bmatrix}$, $A - B = D = \begin{bmatrix} 5 & 4 & 0 \\ -5 & 2 & 1 \end{bmatrix}$, 353
 and $-2A = \begin{bmatrix} -6 & -8 & -2 \\ 2 & 0 & -4 \end{bmatrix}$. 354
 355
 356

For a matrix $A \in M_{n \times m}$, let A_{r_i} denote the i th 357
 row of A and let A_{c_i} denote the i th column of A . 358

Theorem 8 (Matrix multiplication) Let A be 359
 an $m \times n$ matrix and B be a $v \times k$ matrix. Then the 360
 matrix multiplication AB is defined if and only if 361
 $n = v$. Furthermore, suppose that $n = v$ and let 362
 $AB = D$. Then the following statements hold: 363

1. $Size(D) = m \times k$ and $d_{ij} = a_{i,1}b_{1,j} + a_{i,2}b_{2,j} + \dots + a_{i,n}b_{n,j}$ [dot product]. 364
 365
2. $D_{c_i} = b_{1i}A_{c_1} + b_{2i}A_{c_2} + \dots + b_{ni}A_{c_n}$ [linear 366
 combination of the columns of A]. 367

368 3. $D_{r_i} = a_{i1}B_{r_1} + a_{i2}B_{r_2} + \dots + a_{in}B_{r_n}$ [linear
369 combination of the rows of B].

370 Example 4 Let $A = \begin{bmatrix} 1 & 2 & 5 \\ -3 & 0 & 6 \end{bmatrix}$ and $B =$
371 $\begin{bmatrix} 1 & -2 & 3 \\ 0 & 5 & 2 \\ -3 & 7 & -4 \end{bmatrix}$. Then AB is defined by

372 Theorem 8. Let $AB = D$. Then

373 1. $\text{Size}(D) = 2 \times 3$ and $d_{23} = (-3)(3) + (0)(2) +$
374 $(6)(-4)$.

375 2. The second column of D is $D_{c_2} = -2 \begin{bmatrix} 1 \\ -3 \end{bmatrix} +$
376 $5 \begin{bmatrix} 2 \\ 0 \end{bmatrix} + 7 \begin{bmatrix} 5 \\ 6 \end{bmatrix}$.

377 3. The second row of D is $D_{r_2} = -3[1 \ -2 \ 3] +$
378 $0[0 \ 5 \ 2] + 6[-3 \ 7 \ -4]$.

379 Note that BA is undefined by Theorem 8. In fact,
380 it is possible that for some matrices A, B that AB
381 and BA are defined but $AB \neq BA$.

382 Theorem 9 Let i be a positive integer and A be
383 a matrix. Then $A^i = A \times A \times \dots \times A$ (i times)
384 is defined if and only if A is a square matrix, i.e.,
385 $A \in M_{n \times n}$ for some positive integer n .

386 Theorem 10 1. Let $\alpha, \beta \in R(C)$, $A, B \in$
387 $M_{n \times m}$ and let $C \in M_{m \times k}$. Then $(\alpha A +$
388 $\beta B)C = \alpha AC + \beta BC$.

389 2. Let $\alpha, \beta \in R(C)$, $A, B \in M_{n \times m}$ and let $C \in$
390 $M_{k \times n}$. Then $C(\alpha A + \beta B)C = \alpha CA + \beta CB$.

391 3. Let $A \in M_{n \times m}$, $B \in M_{m \times k}$, and $C \in M_{k \times i}$.
392 Then $ABC = (AB)C = A(BC)$.

393 Theorem 11 (Matrix-form of a system of lin-
394 ear equations) Consider the system in (1). Let

395 $C = \begin{bmatrix} a_{11} & a_{12} & \dots & a_{1n} \\ a_{21} & a_{22} & \dots & a_{2n} \\ \vdots & \vdots & \vdots & \vdots \\ a_{m1} & a_{m2} & \dots & a_{mn} \end{bmatrix}$, $X = \begin{bmatrix} x_1 \\ x_2 \\ \vdots \\ x_n \end{bmatrix}$, and

396 $B = \begin{bmatrix} b_1 \\ b_2 \\ \vdots \\ b_m \end{bmatrix}$. Then (in view of Theorem 8(2)), the

397 matrix-form of the system in (1) is $CX = B$,
398 where C is called the coefficient matrix of the
399 system, X is called the variables-column of the
400 system, and B is called the constant column of
401 the system.

Theorem 12 Let $CX = B$ be the matrix-form of
402 a given system of linear equations with m equa-
403 tions and n variables (hence, $\text{size}(C) = m \times n$,
404 $\text{size}(X) = n \times 1$, and $\text{size}(B) = m \times 1$). Then the
405 given system is consistent if and only if there are
406 some real (complex) numbers, r_1, r_2, \dots, r_n , such
407 that $B = r_1C_{c_1} + r_2C_{c_2} + \dots + r_nC_{c_n}$, i.e., B is
408 a linear combination of the columns of C .
409

Example 5 Consider the system:

$x_1 + 2x_3 - x_3 = -1$ 411

$3x_1 + 5x_2 + 2x_3 = 7$ 412

$-x_1 + 2x_2 - 6x_3 = -13$ 413
414

Then $C = \begin{bmatrix} 1 & 2 & -1 \\ 3 & 5 & 2 \\ -1 & 2 & -6 \end{bmatrix}$ is the coefficient 416

matrix, $X = \begin{bmatrix} x_1 \\ x_2 \\ x_3 \end{bmatrix}$ is the variables-column, and 417

$B = \begin{bmatrix} -1 \\ 7 \\ -13 \end{bmatrix}$ is the constant column. Thus, the 418

matrix-form of the system is $CX = B$. 419

Since $B = 1 \begin{bmatrix} 1 \\ 3 \\ -1 \end{bmatrix} + 0 \begin{bmatrix} 2 \\ 5 \\ 2 \end{bmatrix} + 2 \begin{bmatrix} -1 \\ 2 \\ -6 \end{bmatrix}$ 420

is a linear combination of the columns of C ,
421 we conclude that the system is consistent by
422 Theorem 12, and the point $(1, 0, 2)$ is in the
423 solution set of the system (i.e., $x_1 = 1, x_2 = 0,$
424 $x_3 = 2$ is a solution to the system).
425

Let $n \geq 1$ be a positive integer. Then I_n is an
426 $n \times n$ matrix where $i_{11} = i_{22} = \dots = i_{nn} = 1$
427 and $i_{kj} = 0$ if $k \neq j$. We call I_n an **identity**
428 **matrix**. Note that if $n = 1$, then $I_n = 1$.
429

Theorem 13 Let A be a $k \times m$ matrix. Then
430 $AI_m = A$ and $I_k A = A$.
431

Theorem 14 (Row operations and matrix mul-
432 tiplication) Let A be an $n \times m$ matrix and let
433 W be a row operation. Assume that we applied
434 W exactly once on A and we obtained the matrix
435 B , also assume we applied W on the matrix I_n
436 exactly once and we obtained the matrix E . Then
437 $EA = B$.
438

439 A matrix that is obtained from I_n by applying
 440 one row operation on I_n exactly once is called
 441 an **elementary matrix**.

442 *Example 6* Let A be a 2×5 matrix and assume
 443 we applied a sequence of row operations on A ,
 444 and we obtained the matrix B as below:

$$A \xrightarrow{R_1 \leftrightarrow R_2} A_1 \xrightarrow{2R_2 + R_1 \rightarrow R_1} A_2 \xrightarrow{3R_1} B.$$

445 Since we performed exactly three row
 446 operations on A , we should be able to find
 447 three elementary matrices, E_1, E_2, E_3 , such that
 448 $E_3 E_2 E_1 A = B$.

$$449 \quad I_2 \xrightarrow{R_1 \leftrightarrow R_2} E_1 = \begin{bmatrix} 0 & 1 \\ 1 & 0 \end{bmatrix} = E_1$$

$$450 \quad I_2 \xrightarrow{2R_2 + R_1 \rightarrow R_1} E_2 = \begin{bmatrix} 1 & 2 \\ 0 & 1 \end{bmatrix}$$

$$451 \quad I_2 \xrightarrow{3R_1} E_3 = \begin{bmatrix} 3 & 0 \\ 0 & 1 \end{bmatrix}$$

454 Hence, $E_3 E_2 E_1 A = B$.

455 Let A be a square matrix (i.e., $A \in M_{n \times n}$).
 456 We say A is **nonsingular or invertible** if there
 457 exists a matrix denoted by A^{-1} such that $AA^{-1} =$
 458 $A^{-1}A = I_n$. If we cannot find a matrix B such
 459 that $AB = BA = I_n$, then we say A is **singular**
 460 **or non-invertible**.

461 **Theorem 15** Let $A \in M_{n \times n}$ and suppose that A
 462 is invertible. Then A^{-1} is unique. Furthermore,
 463 suppose that $BA = I_n$ for some matrix B . Then
 464 $BA = AB = I_n$, and hence $B = A^{-1}$.

465 **Theorem 16** Let $A \in M_{n \times n}$ and suppose that B
 466 is the reduced row echelon form of A . Then A is
 467 invertible if and only if $B = I_n$.

468 **Theorem 17 (Calculating A^{-1})** Let $A \in M_{n \times m}$
 469 and suppose that we joint I_n to the matrix A ,
 470 and we formed a new matrix denoted by $[A|I_n]$.
 471 Then

472 1. Suppose that we applied a sequence of
 473 row operations on the matrix $[A|I_n]$, and
 474 we obtained the matrix $[D|F]$ (i.e., A is

row-equivalent to D and I_n is row-equivalent
 to F). Then $FA = D$.

2. Suppose A is a square matrix (i.e., $n = m$), and
 we applied a sequence of row operations on
 the matrix $[A|I_n]$, and we obtained the matrix
 $[D|F]$ where D is the reduced row-echelon
 form of A . If $D = I_n$, then $F = A^{-1}$.

Example 7 Let $A = \begin{bmatrix} 4 & 3 \\ 1 & 1 \end{bmatrix}$. We use

Theorem 29(2) in order to find A^{-1} . We form
 the matrix $[A|I_2]$ and we apply a sequence of
 row operations on the matrix $[A|I_2]$ in order
 to obtain the matrix $[D|F]$ where D is the
 reduced row operation form of A . We see that

$$D = I_2 \text{ and } F = \begin{bmatrix} 1 & -3 \\ -1 & 4 \end{bmatrix}. \text{ Thus, } F = A^{-1} \text{ by}$$

Theorem 29(2).

Theorem 18 1. Let $A, B \in M_{n \times n}$ be invertible
 matrices. Then AB is invertible and
 $(AB)^{-1} = B^{-1}A^{-1}$.

2. Let $A \in M_{n \times n}$ be invertible and $\alpha \in R(C)$
 such that $\alpha \neq 0$. Then αA is invertible and
 $(\alpha A)^{-1} = \frac{1}{\alpha} A^{-1}$.

Theorem 19 Let $CX = B$ be the matrix-form
 of a given system of linear equations with n
 equations and n variables. Then the system has
 a unique solution if and only if C is invertible.
 Furthermore, if C^{-1} is the inverse of C , then
 $X = C^{-1}B$.

Example 8 Consider the following system in
 matrix-form $CX = B$, where $C = \begin{bmatrix} 4 & 3 \\ 1 & 1 \end{bmatrix}$,

$$X = \begin{bmatrix} x_1 \\ x_2 \end{bmatrix}, \text{ and } B = \begin{bmatrix} 2 \\ 1 \end{bmatrix}. \text{ Since } C \text{ is invertible}$$

by **Example 7**, we have $X = \begin{bmatrix} x_1 \\ x_2 \end{bmatrix} = C^{-1}B =$

$$\begin{bmatrix} 1 & -3 \\ -1 & 4 \end{bmatrix} \begin{bmatrix} 2 \\ 1 \end{bmatrix} = \begin{bmatrix} -1 \\ 2 \end{bmatrix}. \text{ Thus, } \{(-1, 2)\} \text{ is the}$$

solution set of the system.

Let A be an $n \times m$ matrix. The **transpose of A**
 is denoted by A^T where $a_{ij}^T = a_{ji}$, and hence
 $size(A^T) = m \times n$.

A square matrix $A, n \times n$, is called **symmetric**
 if $A^T = A$, and it is called **skew-symmetric** if
 $A^T = -A$.

- 514 **Theorem 20** 1. Assume that $A, B \in M_{n \times m}$ and
 515 $\alpha, \beta \in R(C)$. Then $(\alpha A + \beta B)^T = \alpha A^T +$
 516 βB^T .
 517 2. Assume that AB is defined for some matrices
 518 A, B . Then $(AB)^T = B^T A^T$.
 519 3. Assume A is a square matrix and $\alpha \in R(C)$.
 520 Then $\alpha(A + A^T)$ is symmetric and $\alpha(A - A^T)$
 521 is skew-symmetric.
 522 4. Assume A is a square matrix, then $A =$
 523 $\frac{1}{2}(A + A^T) + \frac{1}{2}(A - A^T)$, i.e., A is a sum
 524 of a symmetric matrix and a skew-symmetric
 525 matrix.

526 **Theorem 21** Let $A \in M_{n \times n}$. Then A is invert-
 527 ible if and only if A^T is invertible. Furthermore,
 528 if A is invertible, then $(A^T)^{-1} = (A^{-1})^T$.

529 **Determinant and Cramer Rule**

530 Let $A \in M_{n \times n}$ ($n \geq 2$). Then A_{ij} denotes the
 531 matrix obtained from A after deleting the i th row
 532 and the j th column of A . Some authors called
 533 such matrix a **minor of A** . Note that $size(A_{ij}) =$
 534 $(n - 1) \times (n - 1)$. If B is a square matrix, then
 535 $det(B)$ or $|B|$ denotes the determinant of B .

536 **Theorem 22** Let A be a 2×2 matrix, say $A =$
 537 $\begin{bmatrix} a_{11} & a_{12} \\ a_{21} & a_{22} \end{bmatrix}$. Then $det(A) = a_{11}a_{22} - a_{12}a_{21}$.

538 **Theorem 23 (Calculating $det(A)$)** Let $A \in$
 539 $M_{n \times n}$. Then

540 1. Assume that we selected the i th row of A . Then

$$\begin{aligned} det(A) &= (-1)^{i+1} a_{i1} det(A_{i1}) \\ &\quad + (-1)^{i+2} a_{i2} det(A_{i2}) \\ &\quad + \dots + (-1)^{i+n} a_{in} det(A_{in}) \end{aligned}$$

541 2. Assume that we selected the j th column of A .
 542 Then

$$\begin{aligned} det(A) &= (-1)^{j+1} a_{1j} det(A_{1j}) \\ &\quad + (-1)^{j+2} a_{2j} det(A_{2j}) \\ &\quad + \dots + (-1)^{j+n} a_{nj} det(A_{nj}) \end{aligned}$$

3. $det(A)$ is unique and it does not rely on the 543
 row or the column we select, and thus, it is 544
 always recommended that we select a row or 545
 a column of A that has more zeros in order to 546
 calculate $det(A)$. 547

Example 9 Let $A = \begin{bmatrix} 2 & 4 & 3 \\ -4 & 5 & 0 \\ 3 & 2 & 0 \end{bmatrix}$. To find $det(A)$, 548

we observe that the 3rd column of A has more 549
 zeros. Hence, by **Theorem 23(2)**, we have 550

$$det(A) = (-1)^{3+1} 3 det \begin{bmatrix} -4 & 5 \\ 3 & 2 \end{bmatrix} = -69 \quad 551$$

Let $A \in M_{n \times n}$. If $a_{ij} = 0$ whenever $i > j$, 552
 then A is called an **upper triangular matrix**. If 553
 $a_{ij} = 0$ whenever $i < j$, then A is called a **lower** 554
triangular matrix. If $a_{ij} = 0$ whenever $i \neq j$, 555
 then A is called a **diagonal matrix**. If A is upper 556
 triangular or lower triangular or diagonal, then A 557
 is said to be a **triangular matrix**. 558

Theorem 24 Let $A \in M_{n \times n}$ be a triangular 559
 matrix. Then $det(A) = a_{11}a_{22} \dots a_{n-1n-1}a_{nn}$. 560

Theorem 25 1. Let $A \in M_{n \times n}$ be an invertible 561
 upper triangular matrix. Then A^{-1} is an upper 562
 triangular matrix. 563

2. Let $A \in M_{n \times n}$ be an invertible lower trian- 564
 gular matrix. Then A^{-1} is a lower triangular 565
 matrix. 566

3. Let $A \in M_{n \times n}$ be an invertible diagonal 567
 matrix. Then A^{-1} is a diagonal matrix. 568

Theorem 26 Let $A \in M_{n \times n}$. If one of the 569
 following statements hold, then $det(A) = 0$. 570

1. Two rows or two columns of A are identical. 571
2. One row of A is a multiple of another row of 572
 A , or one column of A is a multiple of another 573
 column of A . 574
3. One row or one column of A is entirely zeros. 575

**Theorem 27 (The effect of row operations on 576
 determinant)** Let $A \in M_{n \times n}$. Then, 577

1. Suppose that we applied row operation num- 578
 ber one exactly once on A : $A \ R_i \leftrightarrow R_j \ B$. 579
 Then $det(B) = -det(A)$. 580

581 2. Suppose that we applied row operation num-
 582 ber two exactly once on A : $A \xrightarrow{\alpha R_i} B$. Then
 583 $\det(B) = \alpha \det(A)$.

584 3. Suppose that we applied row opera-
 585 tion number three exactly once on A :
 586 $A \xrightarrow{\alpha R_i + R_j \rightarrow R_j} B$. Then $\det(B) =$
 587 $\det(A)$.

588 **Theorem 28 (Most used method to find a de-**
 589 **terminant)** Let $A \in M_{n \times n}$. It is always recom-
 590 mended that we apply row operations on A in

order to transform A to a triangular matrix, then
 we use [Theorem 27](#) and [Theorem 24](#) to calculate
 $\det(A)$.

Example 10 Let $A = \begin{bmatrix} 2 & 1 & 2 & 1 \\ -2 & 1 & 2 & 6 \\ 4 & 2 & 5 & 1 \\ -2 & -1 & -2 & 3 \end{bmatrix}$. We use

[Theorem 28](#) in order to calculate $\det(A)$.

$$A \xrightarrow{R_1 + R_2 \rightarrow R_2, -2R_1 + R_3 \rightarrow R_3, R_1 + R_4 \rightarrow R_4} B = \begin{bmatrix} 2 & 1 & 2 & 1 \\ 0 & 2 & 4 & 7 \\ 0 & 0 & 1 & -1 \\ 0 & 0 & 0 & 2 \end{bmatrix}$$

596 Since B is obtained from A by applying row
 597 operation number three exactly three times on A
 598 and row operation number three has no effect on
 599 $\det(A)$, we conclude that $\det(A) = \det(B)$ by
 600 [Theorem 27\(3\)](#). Hence, $\det(A) = \det(B) = 8$
 601 by [Theorem 24](#).

602 Example 11 Let $A \in M_{4 \times 4}$ and suppose that

603 $A \xrightarrow{R_1 \leftrightarrow R_2} B \xrightarrow{2R_3} C = \begin{bmatrix} 2 & 2 & 2 & 2 \\ 0 & 1 & 1 & -4 \\ 0 & 0 & 2 & 3 \\ 0 & 0 & 0 & 4 \end{bmatrix}$. By

604 [Theorem 24](#), $\det(C) = 16$. By [Theorem 27\(1\)](#),
 605 $16 = \det(C) = 2\det(B)$, and hence
 606 $\det(B) = 8$. By [Theorem 27\(2\)](#), $8 = \det(B) =$
 607 $-\det(A)$, and hence $\det(A) = -8$.

608 **Theorem 29 (Characterizing invertible matri-**
 609 **ces in terms of determinant)** Let $A \in M_{n \times n}$.
 610 Then A is invertible (nonsingular) if and only if
 611 $\det(A) \neq 0$.

612 **Theorem 30 (Characterizing consistent and**
 613 **inconsistent systems of linear equations in**
 614 **terms of determinant)** Let $CX = B$ be the
 615 matrix-form of a system of linear equations with
 616 n equations and n variables (i.e., $\text{size}(C) =$
 617 $n \times n$). Then:

618 1. The system has a unique solution if and only if
 619 $\det(C) \neq 0$.

2. Assume that the given system is consistent.
 Then the system has infinitely many solutions
 if and only if $\det(C) = 0$.

Theorem 31 1. Let $A, B \in M_{n \times n}$. Then
 $\det(AB) = \det(A)\det(B)$, and it is not
 always true that $\det(A + B) = \det(A) +$
 $\det(B)$.

2. Let $A \in M_{n \times n}$. Then $\det(A^T) = \det(A)$.

3. Let $A \in M_{n \times n}$ be an invertible matrix. Then
 $\det(A^{-1}) = \frac{1}{\det(A)}$.

4. Let $A \in M_{n \times n}$ and $\alpha \in R(C)$. Then
 $\det(\alpha A) = \alpha^n \det(A)$.

Theorem 32 (Adjoint method: calculating A^{-1}
using determinant) Let $A \in M_{n \times n}$ be an invert-
 ible matrix. Then the (i, j) -entry of $A^{-1} =$

$$a_{ij}^{-1} = \frac{(-1)^{i+j} \det(A_{ji})}{\det(A)}$$

(Recall: A_{ji} is the matrix obtained from A after
 deleting the j th row and i th column of A .)

Example 12 Let $A = \begin{bmatrix} 3 & 2 & 1 \\ 0 & 2 & 3 \\ 0 & 0 & 1 \end{bmatrix}$. Then $\det(A) =$

$a_{11}a_{22}a_{33} = (3)(2)(1) = 6$ by [Theorem 24](#).
 Hence, A is invertible by [Theorem 29](#). Thus,
 the $(2, 3)$ -entry of $A^{-1} = a_{23}^{-1} = \frac{(-1)^5 \det(A_{32})}{\det(A)}$

642 by [Theorem 32](#). Now, $A_{32} = \begin{bmatrix} 3 & 1 \\ 0 & 3 \end{bmatrix}$ and
 643 $\det(A_{32}) = 9$. Thus, $a_{23}^{-1} = \frac{-9}{6} = \frac{-3}{2}$.

644 Let $CX = B$ be the matrix-form of a system
 645 of linear equations with n equations and n vari-
 646 ables, say x_1, x_2, \dots, x_n . Then C_i indicates the
 647 matrix obtained from C after replacing the i th
 648 column of C by the constant column B .

649 **Theorem 33 (Cramer rule: solving $n \times n$ sys-**
 650 **tem of linear equations)** *Let $CX = B$ be the*
 651 *matrix-form of a system of linear equations with*
 652 *n equations and n variables, say x_1, x_2, \dots, x_n*
 653 *and suppose that $\det(C) \neq 0$ (and hence, the*
 654 *system has a unique solution by [Theorem 30](#)).*
 655 *Then $x_i = \frac{\det(C_i)}{\det(C)}$.*

656 **Example 13** Consider the system in the matrix-
 657 form $CX = B$, where $C = \begin{bmatrix} 1 & 2 & 1 \\ -1 & 1 & 2 \\ -2 & -4 & 2 \end{bmatrix}$, $X =$

658 $\begin{bmatrix} x_1 \\ x_2 \\ x_3 \end{bmatrix}$, and $B = \begin{bmatrix} 1 \\ 2 \\ -2 \end{bmatrix}$. Then $\det(C) = 12$,

659 $C_1 = \begin{bmatrix} 1 & 2 & 1 \\ 2 & 1 & 2 \\ -2 & -4 & 2 \end{bmatrix}$, $C_2 = \begin{bmatrix} 1 & 1 & 1 \\ -1 & 2 & 2 \\ -2 & -2 & 2 \end{bmatrix}$, $C_3 =$

660 $\begin{bmatrix} 1 & 2 & 1 \\ -1 & 1 & 2 \\ -2 & -4 & -2 \end{bmatrix}$. Thus, by [Theorem 33](#) we have:

661 $x_1 = \det(C_1)/\det(C) = -12/12 = -1$, $x_2 =$
 662 $\det(C_2)/\det(C) = 12/12 = 1$, and $x_3 =$
 663 $\det(C_3)/\det(C) = 0/12 = 0$.

664 Conclusions

665 In this entry, we explicitly explained and stated
 666 all major results on basic matrix operations. We
 667 illustrated all different methods used in solv-
 668 ing system of linear equations using matrices.
 669 The concept of elementary matrices and their
 670 strong relation with row operations is explained
 671 in details. Major results on determinant and its
 672 use are illustrated clearly in this article.

Cross-References

673

- ▶ [Eigenvalues, Singular Value Decomposition](#) 674
- ▶ [Least Squares](#) 675
- ▶ [Matrix Analysis of Networks](#) 676
- ▶ [Matrix Decomposition](#) 677

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