Learning Objective (Jo Hum Is Chapter Mein Seekhenge)

Is chapter mein hum Linear Algebra ke basic concepts aur Data Science mein uska role samajhne wale hain. Hum scalars, vectors, aur matrices ke beech ka difference jaanenge aur matrices par important operations perform karna seekhenge. Specifically, hum yeh seekhenge:

- **✓** Linear Algebra ke fundamentals aur Data Science mein uski importance
- Scalars, Vectors, aur Matrices ka difference aur unki properties
- Matrices ke operations jaise:
 - Addition (जोड़)
 - Multiplication (गुणा)
 - Transposition (पलटना)
 - Determinant nikalna
 - Inverse aur Rank calculate karna

Linear Algebra Kya Hai?

Definition (Paribhasha)

Linear Algebra ek important branch hai mathematics ka, jo mainly vectors, vector spaces, aur linear transformations ka study karta hai. Yeh ek powerful tool hai jo hume linear equations solve karne, linear functions samajhne, aur inhe matrices aur determinants ke through represent karne mein madad karta hai.

Iska **sirf theoretical mathematics** tak hi use nahi hai, balki **bahut saare fields** mein iska **broad application** hai, jaise:

- Machine Learning
- **Computer Graphics**
- Data Science
- Physics & Engineering

Simple Example

Agar aapke paas ek linear equation hai:

$$2x+3y=52x + 3y = 52x+3y=5 x-y=2x - y = 2x-y=2$$

Toh Linear Algebra ke tools ka use karke hum **inhe easily solve** kar sakte hain. Yeh **matrix aur vector representation** ko use karta hai jo complex calculations ko **simple aur fast** banata hai.

Slide-8

Common Linear Algebra Symbols (Aam Linear Algebra Symbols aur Unka Matlab)

Linear Algebra mein **different symbols** ka use hota hai jo **mathematical operations** ko represent karte hain. Neeche kuch important symbols aur unke meanings diye gaye hain:

Symbol Name	Matlab / Usage
· (Dot Product)	Do vectors ka scalar product (Ek number milega result mein)
× (Cross Product)	Do vectors ka vector product jo dono vectors ke orthogonal hoga
ATA^TAT (Transpose of Matrix A)	Matrix ke rows ko columns aur columns ko rows mein convert karna
φ (Null Set)	Aisa set jismein koi bhi element nahi hota
A-1A^{-1}A-1 (Inverse of Matrix A)	Ek aisi matrix jo original matrix ke saath multiply ho kar Identity Matrix de
**(A
Q(A)Q(A)Q(A) (Matrix Rank)	Matrix ke linearly independent rows ya columns ka count
**(
λλλ (Eigenvalue)	Ek scalar jo batata hai ki Linear Transformation vectors ko kaise scale karega
Eigenvector	Ek non-zero vector jo sirf scale hota hai, direction change nahi karta

Slide-9

Role of Linear Algebra in Data Science (Data Science mein Linear Algebra ka Role)

Linear Algebra Data Science ka backbone hai. Har jagah data ko represent karna, analyze karna aur process karna matrices aur vectors ke through hota hai. Yeh Machine Learning, NLP, aur Recommender Systems jaise advanced areas mein bhi use hota hai.

□Data Representation (Data ko Represent Karna)

- Data ko store aur manipulate karne ke liye matrices ka use hota hai.
- Example: Agar ek company ke 1000 customers aur 50 products hain, toh unka data 1000 × 50 matrix mein store ho sakta hai.

Machine Learning Algorithms (ML Algorithms mein Istemaal)

- Support Vector Machines (SVM), Neural Networks jaise ML models matrix operations ka use karte hain.
- Example: Neural Networks weight matrices aur activation functions ka use karke predictions karta hai.

LDimensionality Reduction (Data ka Size Kam Karna - PCA Technique)

• Principal Component Analysis (PCA) jaise techniques linear algebra ka use karke features reduce karti hain.

• Example: Agar ek dataset 1000 features ka hai, toh PCA sirf important features ko select karke data ko chhota aur fast banata hai.

€Recommender Systems (Netflix, Amazon Recommendation Engines)

- Matrix Factorization methods jaise Singular Value
 Decomposition (SVD) ka use recommendations
 generate karne ke liye hota hai.
- Example: Netflix aur Amazon past user preferences ke basis par naye movies/products recommend karte hain using matrix operations.

⑤Natural Language Processing (NLP - Language Processing mein Role)

• Words aur documents ko vectors aur matrices mein represent kiya jata hai.

• Example:

- Word Embeddings (Word2Vec, GloVe): Har word ko
 vector format mein convert karte hain.
- Document-Term Matrix (DTM): Ek matrix jo batata hai ki kisi document mein kaunse words kitni baar aaye hain.

Branches of Linear Algebra (Linear Algebra ke Vibhaag)

Linear Algebra ko **3 main branches** mein divide kiya gaya hai, jo **basic se lekar advanced aur practical applications** tak cover karte hain.

Elementary Linear Algebra (बुनियादी Linear Algebra)

- Basic Concepts: Is branch mein fundamental concepts cover kiye jate hain jaise:
- Scalars, Vectors, Matrices
- Matrix Addition, Multiplication, Transposition
- Linear Equations ka solution using Matrices
- * Example:

Agar ek matrix A hai:

 $A=[1234]A = \left[1324\right]$ \end{bmatrix}A=[1324]

Toh hum **iska transpose** ATA^TAT easily nikal sakte hain:

 $AT=[1324]A^T = \left[1234\right]$ \end{bmatrix}AT=[1234]

2 Advanced Linear Algebra (Advanced Level Concepts)

- Yeh complex topics ko cover karta hai jaise:
- Eigenvalues & Eigenvectors
- Vector Spaces aur Subspaces
- Linear Transformations aur their properties

***** Example:

Agar ek **linear transformation T(x)T(x)T(x)** diya ho, toh **Eigenvalue (λ) aur Eigenvector (v) nikalne** ke liye equation hoti hai:

 $Av = \lambda v A v = \lambda v A v = \lambda v$

Jisme λ ek scalar hota hai jo transformation ka effect batata hai, aur v ek special vector hota hai jo sirf scale hota hai, direction change nahi karta.

& Applied Linear Algebra (Practical Implementation & Applications)

- Yeh Linear Algebra ke real-world applications par focus karta hai, jaise:
- Machine Learning aur Deep Learning
- **✓** Matrix Factorization (Singular Value Decomposition SVD)
- Computer Graphics aur Image Processing
- * Example:
 - Google Search Algorithm: Web pages ki ranking
 Eigenvalues aur Eigenvectors ka use karke hoti hai.
 - Face Recognition Systems: Principal Component Analysis (PCA) ka use karke face detection hoti hai.

Conclusion:

Linear Algebra ek important subject hai jo basic se lekar advanced aur practical applications tak use hoti hai. Data Science, Al, Physics, aur Engineering jaise fields mein iska bahut bada role hai!

Slide-11

Industrial Applications of Linear Algebra (Linear Algebra ka Vyavsayik Upyog)

Linear Algebra **industry ke kai important areas** mein use hoti hai, jaise **Finance aur Computer Vision**. Chaliye inhe detail mein samajhte hain.

Finance (Vitta aur Investment Sector)

- Investors aur financial analysts Linear Algebra ka use risk aur return ko balance karne ke liye karte hain.
- Covariance Analysis aur Linear Equations ka use best asset allocation decide karne mein hota hai.

Example:

Agar ek investor **2 assets (Stock A aur Stock B)** mein invest kar raha hai, toh uska **portfolio optimization** Linear Algebra se hota hai:

Portfolio Risk=wA2σA2+wB2σB2+2wAwBσAB\text{Portfolio Risk} = w_A^2 \sigma_A^2 + w_B^2 \sigma_B^2 + 2 w_A w_B \sigma_{AB}Portfolio Risk=wA2σA2+wB2σB2+2wAwBσAB Jisme:

- wA,wBw_A, w_BwA,wB = investment weights
- σA,σB\sigma_A, \sigma_BσA,σB = individual stock volatility
- σAB\sigma_{AB}σAB = covariance (dono stocks ka risk correlation)
- Isse investors yeh decide kar sakte hain ki kitna paisa kis asset mein lagana chahiye!

Computer Vision (Image Processing aur Al Vision)

- Linear Algebra ke powerful matrix operations ka use image processing techniques jaise:
- ✓ Image Compression (JPEG, PNG Formats)
- Image Enhancement (Brightness aur Contrast Improve karna)
- Edge Detection (Face aur Object Recognition Systems)
- Example Edge Detection (Convolution Technique)
 Image ko matrix ke form mein represent kiya jata hai aur
 convolution operation se edges detect kiye jate hain.

Agar ek 3×3 filter matrix (Kernel) diya jaye:

Toh isko **image matrix par apply** karke **sharp edges detect** kiye ja sakte hain.

• Iska use Face Recognition, Object Detection, aur Medical Imaging jaisi fields mein hota hai!

• Iska use Face Recognition, Object Detection, aur Medical

Conclusion:

Linear Algebra finance aur computer vision jaise industrial fields mein essential role play karti hai. Risk optimization, investment planning, aur Al-based image processing sab Linear Algebra ke bina possible nahi hote!

Slide-12

Industrial Applications of Linear Algebra (Linear Algebra ka Vyavsayik Upyog - Part 2)

Linear Algebra **Robotics, Engineering, Big Data, aur Al** jaise advanced fields mein bhi use hoti hai. Chaliye inhe detail mein samajhte hain.

☐Robotics and Engineering (Robotics aur Engineering mein Linear Algebra ka Use)

- Robots ka movement aur control Linear Algebra se model kiya jata hai.
- State-Space Representation ka use system behavior
 predict aur optimize karne ke liye hota hai.

Example - Robot Arm Movement

Agar ek **robotic arm** ko ek specific position par move karna ho, toh uske motion ko **matrix equations** se solve kiya jata hai:

Ax=BAx=BAx=B

Jisme:

- AAA = Transformation Matrix (Rotation, Scaling, Translation)
- xxx = Robot ke joint angles ka vector
- BBB = Target Position ka vector
- ◆ Yeh technique autonomous robots aur industrial automation mein bahut use hoti hai! 🔄 🌣

DBig Data and Artificial Intelligence (AI)

- Data analysis aur Al models mein Linear Algebra core role play karti hai.
- ◆ PCA (Principal Component Analysis) ka use data dimension reduce karne aur important patterns detect karne ke liye hota hai.

Example - PCA in Big Data

Maan lijiye ek dataset hai jisme **1000 features hain**, toh **ML** algorithms slow ho sakte hain. PCA ka use karke sabse important features select kiye jate hain, jisse data fast process ho aur accuracy bhi bani rahe.

Step-by-Step PCA Working:

- Data ko **standardize** karo (mean = 0, variance = 1).
- **Covariance matrix** banao.
- **Eigenvalues aur Eigenvectors** calculate karo.
- **←Top k Eigenvectors** ko choose karke **new reduced dataset** banao.
- PCA ka use Face Recognition, Fraud Detection, aur Stock
 Market Analysis jaise areas mein hota hai!

Conclusion:

Linear Algebra **Robotics, Engineering, Big Data aur AI** jaise modern applications mein **essential tool** hai. **Autonomous robots, industrial automation aur data-driven AI models**Linear Algebra ke bina impossible hote!

Slide-13

Real-Life Applications of Linear Algebra (Linear Algebra ka Rozmarra Jeevan me Upyog)

Linear Algebra sirf theoretical concept nahi hai, balki bahut saari real-world applications mein iska major role hai. Chaliye kuch important examples ko detail mein samajhte hain.

□Predicting House Prices (Ghar ke Prices ka Prediction) ♠



- House price prediction ke live feature vectors ka use hota hai, jaise:
- Square footage (kitna bada hai ghar?)
- Number of bedrooms (kitne kamre hain?)
- Locality Score (area kitna acha hai?)
- Yeh sab Linear Regression Model ke andar ek Matrix **Equation** me represent kiya jata hai:

$$y^=WX+b\hat{y} = WX + by^=WX+b$$

Jisme:

- XXX = Feature matrix (ghar ke features)
- WWW = Weight vector (kitna impact hai har feature ka)
- bbb = Bias term
- y^\hat{y}y^ = Predicted house price
- Yeh method real estate companies aur banks use karte hain loan approval ke liye! 🏠 📈



- High-resolution images ka size reduce karne ke liye **Singular Value Decomposition (SVD)** ka use hota hai.
 - Bina quality lose kive image compress hoti hai.

Example:

Agar ek 1000x1000 pixels ki image ko compress karna ho, toh SVD algorithm use karke isko chhoti size wali matrix mein **convert** kiya jata hai.

Formula:

A=USVTA = U S V^TA=USVT

Jisme:

- AAA = Original Image Matrix
- U,S,VTU, S, V^TU,S,VT = Compressed matrices
- JPEG format aur video streaming platforms (Netflix, YouTube) yahi technique use karte hain! 🕌

LStock Market Prediction (Share Bazaar ka Analysis) 📊 📉



- Covariance Matrices ka use multiple stocks ke trend aur correlation ko analyze karne ke liye hota hai.
- High-risk aur low-risk stocks ko identify karne ke liye investment strategies me Linear Algebra ka use hota hai.

Example:

Agar Stock A aur Stock B ek-dusre se related hain, toh unka covariance positive hoga, warna negative hoga.

⚠Movie Recommendation Systems (Netflix/Amazon me Suggestions kaise milte hain?) **i**

- Matrix Factorization ka use movie recommendation systems me hota hai.
- Netflix, Amazon, aur Spotify jaise platforms yeh technique use karte hain!
- **Example User Preference Prediction using SVD**Maan lo ek user ke pasand na pasand ka matrix diya hai:

User Movie 1 Movie 2 Movie 3 Movie 4

A 5 ? 3 ?

B ? 4 ? 5

- "?" wale missing ratings ko predict karne ke liye SVD algorithm ka use hota hai!
- Spotify aur YouTube bhi isi concept par song/video
 recommendations dete hain!

5 Self-Driving Cars (Khud chalne wali Gaadiyan - Tesla, Waymo) ♣ ♥

◆ Image Recognition, Object Detection, aur Decision-Making ke liye Linear Algebra ke transformations use hote hain.

- Example Camera ka Input Process Karna

 Agar ek self-driving car ko samne pedestrian ya traffic light

 dikh rahi hai, toh uska data matrix transformation se process

 hota hai:
- Image Matrix → Edge Detection → Object RecognitionDecision Making
- Tesla, Google Waymo, aur Uber Automated Vehicles
 Linear Algebra ka use karte hain!

Conclusion:

Linear Algebra har industry me use hoti hai, chahe real estate, finance, AI, robotics ya entertainment ho. Data Science aur AI ke bina aaj ke modern applications possible nahi hain!

Slide-14

Scalars: Definition and Representation (Scalars Kya Hote Hain?)

Definition (Paribhasha)

Scalar ek single numerical value hota hai jo sirf magnitude (maatra) batata hai, direction (disha) nahi.

Scalar quantities simple mathematical operations

(addition, subtraction, multiplication, division) ko follow karti hain.

Example:

Agar temperature 20°C hai, toh yeh sirf ek numerical value hai aur iski koi direction nahi hai.

- Representation of Scalars (Scalars ko kaise dikhaya jata hai?)
- Scalars ko **chhoti (lowercase) letters** se represent kiya jata hai, jaise:

a,b,c,Ta, b, c, Ta,b,c,T

Example:

- Temperature → T=20°CT = 20°CT=20°C
- Speed → s=50s = 50s=50 km/h (direction nahi bataya gaya)
- **Height** \rightarrow h=170h = 170h=170 cm

Examples of Scalar Quantities (Scalars ke Real-Life Examples)

 \square Mass (Vajan) \rightarrow 10 kg \rightarrow Sirf weight batata hai, koi direction nahi.

\squareTime (Samay) \rightarrow **5 seconds** \rightarrow Sirf ek number hai, direction nahi.

BDistance (Doori) \rightarrow **100 meters** \rightarrow Kitni doori cover ki gayi,

lekin kis direction me, yeh nahi batata.

Temperature (Taapmaan) → **30°C** → Yeh sirf **garmi ya thandi batata hai**, koi direction nahi.

Scalar ka Simple Rule: Agar koi value direction specify nahi karti toh woh scalar quantity hoti hai!

Conclusion:

Scalars **simple numerical values** hote hain jo **magnitude specify** karte hain **lekin direction nahi** dete.

Ab hum **Vectors** ke baare mein detail mein samjhenge, jo magnitude ke saath direction bhi show karte hain!

Slide-15

Vectors: Definition, Operations, and Interpretations

Definition (Paribhasha)

Vector ek **ordered collection of numbers** hota hai jo **magnitude (maatra) aur direction (disha)** dono ko represent karta hai.

- Scalar aur Vector ka Basic Difference:
 - Scalar → Sirf magnitude hota hai, koi direction nahi (e.g., Mass, Time, Temperature).

- Vector → Magnitude + Direction dono hoti hain (e.g., Velocity, Force, Position).
- Geometric Interpretation (Vector ka Visual Representation)
- Vectors ko ek arrow (teer) se represent kiya jata hai:
 - Arrow ki length → Vector ka magnitude batati hai.
 - Arrow ki direction → Vector kis disha me ja raha hai, yeh batata hai.
- Example:

Agar ek vector $\mathbf{v} = [3,4]$ diya hai, toh iska matlab:

- Origin (0,0) se ek arrow (vector) point (3,4) tak ja raha
- Yeh ek **2D plane** me position batata hai.
- Graphically yeh aise dikhai deta hai:
- $(0,0) \rightarrow (3,4)$ (Arrow Pointing Towards [3,4])
- Examples of Vectors (Vectors ke Real-Life Examples)

□Velocity (Raftaar aur Disha)

- Velocity ek vector quantity hai kyunki yeh speed ke saath direction bhi batata hai.
- Example: "Ek car 60 km/h East ja rahi hai."
 - Speed (60 km/h) = Magnitude

East = Direction

2Force (Bal)

- Jab hum ek object ko push ya pull karte hain, toh usme ek force lagta hai jo direction aur magnitude dono specify karta hai.
- Example: Koi object 10 Newton force se right direction me move ho raha hai.

Position (Sthiti ya Location)

Kisi bhi object ki position specify karne ke liye
 coordinates ka use hota hai, jo ek vector represent karta hai.

• Example:

Agar ek point P = (2,5,7) diya hai, toh yeh ek 3D
 space me position batata hai.

Conclusion:

Vectors magnitude aur direction dono ko represent karte hain. Yeh Physics, Engineering, aur Data Science me bahut important role play karte hain.

Slide-16

Examples of Scalar and Vector

- Scalar Examples (Magnitude Only, No Direction)
- Scalar quantities sirf magnitude batati hain, direction nahi hota.

Disperse (Raftaar) \rightarrow 60 km/h (Direction specify nahi kiya)

 \square Mass (Vajan) \rightarrow 10 kg (Sirf wajan hai, direction nahi)

Nolume (Aayatan) → **2 liters** (Sirf kitna space cover kiya, direction nahi)

Time (Samay) → 5 seconds (Bas duration hai, koi disha nahi)

- Vector Examples (Magnitude + Direction)
- ✓ Vectors magnitude ke saath direction bhi specify karte hain.

EVelocity (Raftaar + Disha) → 60 km/h East (Speed ke saath direction bhi)

∑Weight (Bhar ya Taakat) → **500 N downward** (Gravity ke karan neeche ki taraf force)

 \blacksquare Friction (Gharshan Bal) \rightarrow Opposite direction me lagta hai (Jab ek object move karta hai)

4Force (Bal) → Ek object par 10 N ka force Right me lag raha hai

- Simple Rule:
 - · Sirf number hai, toh Scalar!
 - Number + Direction hai, toh Vector!

Slide-17 **Differences Between Scalar and Vector Quantities**

Feature	Scalar Quantity (Keval Magnitude)	Vector Quantity (Magnitude + Direction)
Definition	Sirf magnitude hota hai.	Magnitude + Direction dono hote hain.
Dimensions	Sirf 1D (one dimension) me exist karta hai.	1D, 2D ya 3D kisi bhi dimension me ho sakta hai.
Change Effect	Sirf magnitude change hota hai.	Magnitude ya direction, dono change ho sakte hain.
Resolution	Components me nahi toda ja sakta.	Components me toda ja sakta hai using trigonometric functions.
Mathematical Operations	Operations ka result hamesha scalar hota hai.	Operations ka result scalar ya vector dono ho sakta hai (Dot product → Scalar, Cross product → Vector).

Scalar Quantity
(Keval

Vector Quantity

(Magnitude + Direction)

Magnitude + Direct

Mass, Speed, Velocity, Force,

Examples Time, Area, Displacement,

Volume. Acceleration.

Short Trick to Remember:

- Sirf number → Scalar
- Number + Direction → Vector

 ✓

Slide-18

Feature

Lab

Slide-19

Vector Operations (Vector par Kiya Jane Wale Calculation)

Vectors par **direct arithmetic operations** (jaise normal numbers ka addition ya division) **possible nahi** hote. Isliye, vectors ke saath kaam karne ke liye **special vector operations** use kiye jate hain.

1. Vector Addition (Vectors ko jodna)

- ✓ Do ya zyada vectors ko combine karne ke liye use hota hai.
- ✓ Example:

$$A = (2, 3)$$

$$B = (4, 1)$$

$$A + B = (2+4, 3+1) = (6, 4)$$

- 2. Vector Subtraction (Vectors ka antar nikalna)
- ✓ **Do vectors ke beech difference** nikalne ke liye use hota hai.
- ✓ Example:

$$A = (5, 7)$$

$$B = (2, 3)$$

$$A - B = (5-2, 7-3) = (3, 4)$$

- 3. Scalar Multiplication (Vector ko Scalar se Multiply karna)
- ✓ Ek vector ko kisi scalar (single number) se multiply karna.
- ✓ Example:

Vector
$$A = (3, 5)$$

Scalar
$$k = 2$$

$$k * A = (2 \times 3, 2 \times 5) = (6, 10)$$

4. Product of Two Vectors (Do Vectors ka Guna Karna)

Vectors ka division **nahi hota**, lekin **multiplication do tarike se ho sakta hai**:

- ✓ Dot Product (•) → Scalar Output
- ✓ Result hamesha ek scalar (number) hota hai.
- ✓ Formula: A B = |A| |B| cos(θ)
- √ Example:

$$A = (2, 3), B = (4, 1)$$

$$A \bullet B = (2 \times 4) + (3 \times 1) = 8 + 3 = 11$$

- Cross Product (×) → Vector Output
- ✓ Result ek naya vector hota hai jo dono input vectors ke perpendicular hota hai.
- ✓ Formula: $A \times B = |A| |B| \sin(\theta)$
- √ Example:

$$A = (i, j, k) = (1, 2, 3)$$

$$B = (i, j, k) = (4, 5, 6)$$

A × B ka result ek **naya vector** hoga.

- Short Trick to Remember:
 - Dot Product → Scalar Output

Slide-19

Vector Addition: Triangle Law of Vector Addition

Concept:

Agar do vectors ko ek triangle ke do sides ke roop me represent kiya jaye, toh unka sum (resultant vector) triangle ki teesri side hoti hai.

▼ Triangle Law ke Mutabik:

Agar do vectors ko sequence me rakha jaye, toh unka sum ek naya vector hoga jo first vector ke start point se second vector ke end point tak jayega.

Triangle Law Explanation with Figure:

- **Evector "a"** ko **AB line** represent karti hai.
- **"Dector "b"** ko **BC line** represent karti hai.
- Resultant Vector (a + b) ko AC line represent karti hai.
- **4** AC ka direction hamesha A se C ki taraf hota hai.
- Magnitude (Length) of Resultant Vector:

 $|R|=|a|2+|b|2+2|a||b|\cos\Theta(\theta)|R| = \sqrt{|a|^2 + |b|^2 + 2}$ $|a||b|\cos(\theta)|R|=|a|2+|b|2+2|a||b|\cos(\theta)$

ightharpoonup Yahan θ\thetaθ do vectors ke beech ka angle hota hai.

Simple Example:

Maan lo, ek aadmi east ki taraf 5 km chalta hai (Vector A) aur fir north ki taraf 12 km chalta hai (Vector B).

✓ Triangle Law ke hisaab se, aadmi ka total displacement ek diagonal line (hypotenuse) hoga:

R=52+122=25+144=169=13kmR = $\sqrt{5^2 + 12^2}$ = $\sqrt{25 + 144}$ = $\sqrt{169}$ = 13 kmR=52+122=25+144=169 = 13km

★ Toh aadmi ka net displacement 13 km hoga, jo directly start point se end point tak jata hai.

- Short Trick to Remember:
 - Triangle ke 2 sides → Vectors

Slide-20