

# EigenVectors, EigenValues, EigenSpaces

Linear Algebra  
MATH 2076



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## Example (A $2 \times 2$ matrix with 2 LI eigenvectors)

$$\text{For } A = \begin{bmatrix} 4 & -1 \\ 2 & 1 \end{bmatrix}, A \begin{bmatrix} 1 \\ 1 \end{bmatrix} = \begin{bmatrix} 3 \\ 3 \end{bmatrix} = 3 \begin{bmatrix} 1 \\ 1 \end{bmatrix} \text{ and } A \begin{bmatrix} 1 \\ 2 \end{bmatrix} = \begin{bmatrix} 2 \\ 4 \end{bmatrix} = 2 \begin{bmatrix} 1 \\ 2 \end{bmatrix}.$$

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See the geogebra file [Eigen2x2Ex1gbg](#).

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What do items (3) and (4) above tell us?

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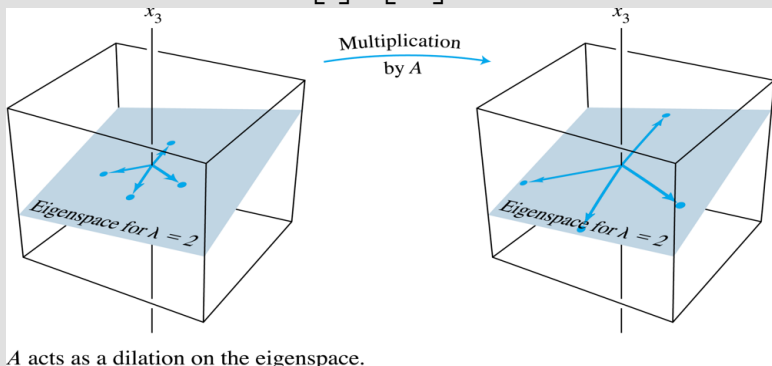
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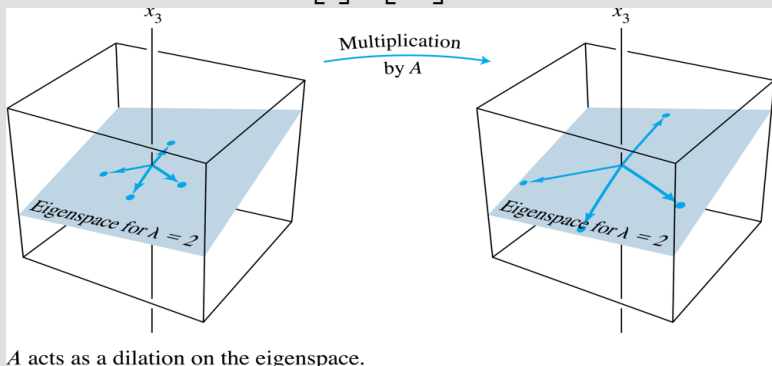
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See [Eigen3x3Ex1.ggb](#)

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Notice that the two eigenvectors for  $A$  are LI, so form a basis. 