

# Lecture 16

Math 22 Summer 2017 July 24, 2017



- §4.4 Finish up
- §4.5 Dimension

#### The matrix of a linear transformation revisited







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We define the matrix of  ${\cal T}$  relative to the bases  ${\cal B}$  and  ${\cal C}$ , denoted  $_{\cal C}[{\cal T}]_{\cal B}$  by

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How does this relate to coordinate vectors?

### §4.4 Change of coordinates





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The matrix  $_{C}[id]_{\mathcal{B}}$  is called the **change of coordinates matrix from**  $\mathcal{B}$  to  $\mathcal{C}$ . Let's see how this works in our classwork example (back page)! https://math.dartmouth.edu/~m22x17/ section2lectures/classwork15.pdf

## §4.4 Example (derivative)





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$${}_{\mathcal{C}}[\mathcal{T}]_{\mathcal{B}} = \left[ [\mathcal{T}(1)]_{\mathcal{C}} [\mathcal{T}(t)]_{\mathcal{C}} [\mathcal{T}(t^2)]_{\mathcal{C}} [\mathcal{T}(t^3)]_{\mathcal{C}} \right] = \begin{bmatrix} 0 \ 1 \ 0 \ 0 \\ 0 \ 0 \ 2 \ 0 \\ 0 \ 0 \ 3 \end{bmatrix}.$$



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$$\begin{bmatrix} 0 & 1 & 0 & 0 \\ 0 & 0 & 2 & 0 \\ 0 & 0 & 0 & 3 \end{bmatrix} \begin{bmatrix} 2 \\ 3 \\ 4 \\ 5 \end{bmatrix} = \begin{bmatrix} 3 \\ 8 \\ 15 \end{bmatrix}$$



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and  $T(2+3t+4t^2+5t^3) = 3+8t+15t^2$ .













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#### Proof.

Map to coordinates and use the same fact about  $\mathbb{R}^n$  to get a dependence relation.

# §4.5 Theorem 10






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# §4.5 Definition of dimension







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Examples?



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Examples? What about subspaces?

# §4.5 Theorem 11





#### Let H be a subspace of a finite-dimensional vector space V.





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Let S be a linearly independent set in H. If S spans H then we are done.



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Let S be a linearly independent set in H. If S spans H then we are done. If not, then there exists  $\mathbf{u}_1 \in H$  that is not in the span of S. Append  $\mathbf{u}_1$  to S. Prove that the set S together with this new element  $\mathbf{u}_1$  is linearly independent.





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Note that this proof works in the infinite-dimensional case as well, but requires Zorn's Lemma.



# §4.5 Theorem 12







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Corollary of previous theorem and the spanning set theorem.

# §4.5 Dimensions of Nul A and ColA







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### Theorem

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The dimension of ColA is the number of pivot columns in A.

What's the proof?







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**Solution:** First why is *H* a subspace?



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Now, how does this tell us the dimension of H?