## Linear Algebra

Oleg Viro

01/30/2020

## YouTube lectures

The author of the textbook, Profesor Sheldon Axler

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The reference to the whole list:
https://www.youtube.com/playlist?list=PLGAnmvB9m7zOBVCZBUUmSinFV0wEir2Vw

## Fields

## Reminding:

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The space of polynomials

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Examples of subspaces. In $\mathbb{R}^{1}$

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Examples of subspaces. In $\mathbb{R}^{1}, \mathbb{R}^{2}, \mathbb{R}^{3}$.
Linear conditions: continuity, differentiablity.

Theorem. Intersection of any collection of subspaces is a subspace.

## Intersection and sums

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Definition: sum of subsets Let $U_{1}, \ldots, U_{m}$ be subsets of a vector space $V$.

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Theorem. If $U_{1}, \ldots, U_{m}$ are subspaces of a vector space $V$, then $U_{1}+\cdots+U_{m}$ is the smallest subspace of $V$ containing $U_{1}, \ldots, U_{m}$.

## Direct sums

## Definition: direct sum <br> $U_{1}+\cdots+U_{m}$ is called a direct sum and is denoted by $U_{1} \oplus \cdots \oplus U_{m}$ if each $u \in U_{1}+\cdots+U_{m}$ has a unique presentation as $u_{1}+\cdots+u_{m}$ with $u_{j} \in U_{j}$.

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Which way?
Special case: $m=2$.
If $U, W$ are subspaces of a vector space $V$, then

$$
U+W=U \oplus W \quad \text { iff } U \cap W=\{0\}
$$

