

Probabilistic Programming for Scientific Discovery

Lecture 3

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Lviv Data Science Summer School

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What is type 2?

- Definition of type 2 machine learning from Yoshua Bengio's talk with reference

Including Generative Models

- Oracle construction or surrogates whatever you seek to call it
- GANs
 - Theory
 - Embedded in a probabilistic programming system
- Variational Autoencoders
 - Theory
 - Embedded in a probabilistic programming system

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