

Advanced Topics in Machine Learning: Deep Generative Models (<https://kuleshov.github.io/cornell-deep-generative-models-course/>)

CS 6784 - Spring 2020

Detailed Syllabus

| Week | Date | Lecture Topics | Coursework | Additional Readings |
|------|-------------|--|-----------------------------------|--|
| 1 | Jan 21 & 23 | Introduction and Background (slides 1 (https://kuleshov.github.io/cornell-deep-generative-models-course/assets/slides/lecture1_2019.pdf), slides 2 (https://kuleshov.github.io/cornell-deep-generative-models-course/assets/slides/lecture2.pdf)) | | |
| 2 | Jan 28 & 30 | Autoregressive Models (slides 3 (https://kuleshov.github.io/cornell-deep-generative-models-course/assets/slides/lecture3.pdf), slides 4 (https://kuleshov.github.io/cornell-deep-generative-models-course/assets/slides/lecture4.pdf)) | HW 1 released | van den Oord et al. (2016a (https://arxiv.org/abs/1601.06759), 2016b (https://arxiv.org/abs/1609.03499)) Kalchbrenner et al. (2016 (https://arxiv.org/abs/1610.10099)) Vaswani et al. (2017 (https://arxiv.org/abs/1706.03762)) |
| 3 | Feb 4 & 6 | Variational Autoencoders (slides 5 (https://kuleshov.github.io/cornell-deep-generative-models-course/assets/slides/lecture5.pdf), slides 6 (https://kuleshov.github.io/cornell-deep-generative-models-course/assets/slides/lecture6.pdf)) | | Kingma et al. (2014 (https://arxiv.org/abs/1406.5298)) Gregor et al. (2015 (https://arxiv.org/abs/1502.04623)) Burda et al. (2016 (https://arxiv.org/abs/1509.00519)) Maddison et al. (2017 (https://arxiv.org/abs/1705.09279)) |
| 4 | Feb 11 & 13 | Normalizing Flow Models (slides 7 (https://kuleshov.github.io/cornell-deep-generative-models-course/assets/slides/lecture7.pdf), slides 8 (https://kuleshov.github.io/cornell-deep-generative-models-course/assets/slides/lecture8.pdf)) | HW1 due (02/13), HW 2 released | Kingma and Dhariwal (2018 (https://papers.nips.cc/paper/8224-glow-generative-flow-with-invertible-1x1-convolutions.pdf)) Chen et al. (2018 (https://arxiv.org/abs/1806.07366)) Chen et al. (2019 (https://arxiv.org/abs/1906.02735)) Kumar et al. (2019 (https://arxiv.org/abs/1903.01434)) |
| 5 | Feb 18 & 20 | Generative Adversarial Networks (slides 9 (https://kuleshov.github.io/cornell-deep-generative-models-course/assets/slides/lecture9.pdf), | | Dumoulin et al. (2016 (https://arxiv.org/abs/1606.00704)) Arjofsky et al. (2017 (https://arxiv.org/abs/1701.07875)) Zhu et al. (2017 (https://arxiv.org/abs/1703.10593)) |

| | | | | |
|----|----------------|--|---------------------|--|
| | | slides 10 (https://kuleshov.github.io/cornell-deep-generative-models-course/assets/slides/lecture10.pdf)) | | |
| | | Project Proposal: Due Thursday, February 20, 2020. | | |
| 6 | Feb 27 | Energy-Based Models (slides 11 (https://kuleshov.github.io/cornell-deep-generative-models-course/assets/slides/lecture11.pdf)) | HW 2 due (02/27) | |
| 7 | Mar 3 & 4 | Combining Generative Model Variants Evaluating Generative Models (slides 12 (https://kuleshov.github.io/cornell-deep-generative-models-course/assets/slides/lecture12.pdf), slides 13 (https://kuleshov.github.io/cornell-deep-generative-models-course/assets/slides/lecture13.pdf)) | | |
| 8 | Mar 10 & 12 | Discreteness in Generative Modeling (slides 14 (https://kuleshov.github.io/cornell-deep-generative-models-course/assets/slides/lecture14.pdf)) March 12: Postponed due to move to videoconferencing. | HW 3 released | |
| 9 | Mar 17 & 19 | Student Presentations 3/17: Boyi Li and Junwen Bai: Uncertainty in DGMs 3/19: Yixin Shen and Youya Xia: Generative Models in RL | | |
| 10 | Mar 24 & 26 | Student Presentations 03/24: Evgenii Nikishin and Yicheng Bai: Noise Contrastive Estimation 03/26: Utkarsh Mall and Hubert Lin | HW 3 due (03/26) | |
| 11 | Mar 31 & Apr 2 | Spring Break | | |
| 12 | Apr 7 & 9 | Student Presentations 04/07: Jack Wang and Joseph Kim 04/09: Dan Adler and Gengmo Qi | | |
| | | Project Progress Report: Due April 9, 2020. | | |
| 13 | Apr 14 & 16 | Student Presentations 04/14: Yong Huang and Yordanos Goshu: Combining GANs and variational inference 04/16: Kai Zhang, and Rui Qian | | |
| 14 | Apr | Student Presentations | | |

| | | | | |
|----|-------------|--|--|--|
| | 21 & 23 | 04/21: Guandao Yang and Wenqi Xian: Normalizing Flows 04/23: Shachi Deshpande, Alex Wang and Arman Mielke | | |
| 15 | Apr 28 & 30 | 04/28: Joseph Kim and Zekun Hao: Wasserstein GANs 04/30: Guest Lecture | | |
| 16 | May 5 | Student Presentations 05/06: Kane Tian and Aaron Lou | | |
| 17 | May 9-16 | Exam Week (no lectures) | | |
| | | Final Project Reports: Due May 14, 2020. | | |

Additional Reading: Surveys and Tutorials

1. Tutorial on Deep Generative Models. (<https://ermongroup.github.io/generative-models/>) Aditya Grover and Stefano Ermon. International Joint Conference on Artificial Intelligence, July 2018.
2. Tutorial on Generative Adversarial Networks. (<https://sites.google.com/view/cvpr2018tutorialongans/>) Computer Vision and Pattern Recognition, June 2018.
3. Tutorial on Deep Generative Models. (<https://www.youtube.com/watch?v=JrO5fSskISY>) Shakir Mohamed and Danilo Rezende. Uncertainty in Artificial Intelligence, July 2017.
4. Tutorial on Generative Adversarial Networks. (<https://www.youtube.com/watch?v=AJVyzd0rqdc>) Ian Goodfellow. Neural Information Processing Systems, December 2016.
5. Learning deep generative models. (<https://www.cs.cmu.edu/~rsalakhu/papers/annrev.pdf>) Ruslan Salakhutdinov. Annual Review of Statistics and Its Application, Apr 2015.