



(<http://svl.stanford.edu/>) (<http://stanford.edu/>)



CS231n: Convolutional Neural Networks for Visual Recognition

([index.html](#))

Schedule and Syllabus

The Spring 2020 iteration of the course will be taught virtually for the entire duration of the quarter. (more information available here (<https://healthalerts.stanford.edu/2020/03/19/stanford-update-for-thursday-evening-march-19-new-information-on-spring-quarter/>))

Unless otherwise specified the lectures are Tuesday and Thursday 12pm to 1:20pm.

Discussion sections will (generally) be Fridays 12:30pm to 1:20pm. Check Piazza for any exceptions.

Lectures and discussion sections will be both on Zoom, and they will be recorded for later access from Canvas.

This is the syllabus for the **Spring 2020** iteration of the course. The syllabus for the Spring 2019 (<http://cs231n.stanford.edu/2019/syllabus>), Spring 2018 (<http://cs231n.stanford.edu/2018/syllabus>), Spring 2017 (<http://cs231n.stanford.edu/2017/syllabus>), Winter 2016 (<http://cs231n.stanford.edu/2016/syllabus>) and Winter 2015 (<http://cs231n.stanford.edu/2015/syllabus>) iterations of this course are still available.

Event Type	Date	Description	Course Materials
Lecture 1	Tuesday April 7	Course Introduction Computer vision overview Historical context Course logistics	[Course Overview] (slides/2020/lecture_1_ranjay.pdf) [History of Computer Vision] (slides/2020/lecture_1_feifei.pdf)
Lecture 2	Thursday April 9	Image Classification The data-driven approach K-nearest neighbor Linear classification I	[slides] (slides/2020/lecture_2.pdf) [python/numpy tutorial] (http://cs231n.github.io/python-numpy-tutorial) [image classification notes] (http://cs231n.github.io/classification) [linear classification notes] (http://cs231n.github.io/linear-classify)
Discussion Section	Friday April 10	Python / numpy / Google Cloud	[python/numpy tutorial] (http://cs231n.github.io/python-numpy-tutorial) [Google Cloud tutorial] (https://github.com/cs231n/gcloud)
Lecture 3	Tuesday April 14	Loss Functions and Optimization Linear classification II Higher-level representations, image features Optimization, stochastic gradient descent	[slides] (slides/2020/lecture_3.pdf) [linear classification notes] (http://cs231n.github.io/linear-classify) [optimization notes] (http://cs231n.github.io/optimization-1)
Lecture 4	Thursday April 16	Neural Networks and Backpropagation Backpropagation Multi-layer Perceptrons The neural viewpoint	[slides] (slides/2020/lecture_4.pdf) [backprop notes] (http://cs231n.github.io/optimization-2) [linear backprop example] (handouts/linear-backprop.pdf) [derivatives notes] (handouts/derivatives.pdf) (optional) [Efficient BackProp] (http://yann.lecun.com/exdb/publis/pdf/lecun-98b.pdf) (optional) related: [1] (http://colah.github.io/posts/2015-08-Backprop/), [2] (http://neuralnetworksanddeeplearning.com/chap2.html), [3] (https://www.youtube.com/watch?v=q0pm3BrIUfo) (optional)
Discussion Section	Friday April 17	Backprop tutorial	[slides] (slides/2020/section_2_backprop.pdf) [annotated slides] (slides/2020/section_2_annotated.pdf)
Lecture 5	Tuesday April 21	Convolutional Neural Networks History Convolution and pooling ConvNets outside vision	[slides] (slides/2020/lecture_5.pdf) ConvNet notes (http://cs231n.github.io/convolutional-networks/)
A1 Due	Wednesday April 22	Assignment #1 due kNN, SVM, SoftMax, two-layer network	[Assignment #1] (https://cs231n.github.io/assignments2020/assignment1/)

Lecture 6	Thursday April 23	Deep Learning Hardware and Software CPUs, GPUs, TPUs PyTorch, TensorFlow Dynamic vs Static computation graphs	[slides] (slides/2020/lecture_6.pdf)
Discussion Section	Friday April 24	Projects	[proposal description] (http://cs231n.stanford.edu/project.html) [slides] (slides/2020/section_3_project.pdf)
Lecture 7	Tuesday April 28	Training Neural Networks, part I Activation functions, data processing Batch Normalization, Transfer learning	[slides] (slides/2020/lecture_7.pdf) Neural Nets notes 1 (http://cs231n.github.io/neural-networks-1/) Neural Nets notes 2 (http://cs231n.github.io/neural-networks-2/) Neural Nets notes 3 (http://cs231n.github.io/neural-networks-3/) tips/tricks: [1] (http://research.microsoft.com/pubs/192769/tricks-2012.pdf), [2] (http://yann.lecun.com/exdb/publis/pdf/lecun-98b.pdf), [3] (http://arxiv.org/pdf/1206.5533v2.pdf) (optional) Deep Learning [Nature] (http://www.nature.com/nature/journal/v521/n7553/full/nature14539.html) (optional)
Proposal due	Monday April 27	Project Proposal due	
Lecture 8	Thursday April 30	Training Neural Networks, part II Update rules, hyperparameter tuning, Learning rate scheduling, data augmentation	[slides] (slides/2020/lecture_8.pdf) Neural Nets notes 3 (http://cs231n.github.io/neural-networks-3/)
Discussion Section	Friday May 1	Intro to Pytorch and Tensorflow	[PyTorch Colab Walkthrough] (https://pytorch.org/tutorials/beginner/finetuning_torchvision_models_tutorial.html) (See Canvas for recording)
Lecture 9	Tuesday May 5	CNN Architectures AlexNet, VGG, GoogLeNet, ResNet, etc	[slides] (slides/2020/lecture_9.pdf) AlexNet (https://papers.nips.cc/paper/4824-imagenet-classification-with-deep-convolutional-neural-networks.pdf), VGGNet (https://arxiv.org/abs/1409.1556), GoogLeNet (https://arxiv.org/abs/1409.4842), ResNet (https://arxiv.org/abs/1512.03385)
A2 Due	Wednesday May 6	Assignment #2 due Neural networks, ConvNets	[Assignment #2] (https://cs231n.github.io/assignments2020/assignment2/)
Lecture 10	Thursday May 7	Recurrent Neural Networks RNN, LSTM Language modeling Image captioning, Vision + Language Attention	[slides] (slides/2020/lecture_10.pdf) DL book RNN chapter (http://www.deeplearningbook.org/contents/rnn.html) (optional) min-char-rnn (https://gist.github.com/karpathy/d4dee566867f8291f086), char-rnn (https://github.com/karpathy/char-rnn), neuraltalk2 (https://github.com/karpathy/neuraltalk2)
Discussion Section	Friday May 8	Midterm Review	[slides] (slides/2020/section_5_midterm.pdf)
Midterm	Tuesday May 12	Take-home midterm	
Lecture 11	Thursday May 14	Generative Models PixelRNN/PixelCNN Variational auto-encoders Generative adversarial networks	[slides] (slides/2020/lecture_11.pdf) VAE Notes (https://deepgenerativemodels.github.io/notes/vae/) NeurIPS 2016 GAN Tutorial (https://arxiv.org/pdf/1701.00160.pdf)
Discussion Section	Friday May 15	Tensorflow Tutorial	[Colab Link] (https://www.tensorflow.org/tutorials/images/transfer_learning)

Lecture 12	Tuesday May 19	Detection and Segmentation Semantic segmentation Object detection Instance segmentation	[slides] (slides/2020/lecture_12.pdf)
Milestone	Wednesday May 20	Project Milestone due	
Lecture 13	Thursday May 21	Visualizing and Understanding Feature visualization and inversion Adversarial examples DeepDream and style transfer	[slides] (slides/2020/lecture_13.pdf) DeepDream (https://github.com/google/deepdream) neural-style (https://github.com/jcjohnson/neural-style) fast-neural-style (https://github.com/jcjohnson/fast-neural-style)
Discussion Section	Friday May 22	Detection Software	[slides] (slides/2020/section_7_detection.pdf)
Lecture 14 Guest Lecture	Tuesday May 26	Fairness Accountability Transparency and Ethics in AI Timnit Gebru (http://ai.stanford.edu/~tgebru/), Emily Denton (https://cephaloponderer.com/)	[slides] (slides/2020/lecture_14.pdf)
A3 Due	Wednesday May 27	Assignment #3 due RNNs, LSTMs, Network Visualization, Style Transfer, GANs	[Assignment #3] (https://cs231n.github.io/assignments2020/assignment3/)
Lecture 15	Thursday May 28	Human-Centered Artificial Intelligence Fei-Fei Li (https://profiles.stanford.edu/fei-fei-li)	
Discussion Section	Friday May 29	Learning on Videos	
Lecture 16 Guest Lecture	Tuesday June 2	3D Vision Hao Su (https://cseweb.ucsd.edu/~haosu/)	
Lecture 17	Thursday June 4	Deep Reinforcement Learning Policy gradients, hard attention Q-Learning, Actor-Critic	
Final Project Due	Friday June 5	Project Report + Video Presentation due	
Lecture 18	Tuesday June 9	Scene Graphs Visual Relationships Graph Neural Networks	
Lecture 19	Thursday June 11	TBD	