tejasgokhale.com

CMSC 475/675 Neural Networks

Lecture 0: init ()



Tejas Gokhale ~ **Tejas: Gokhale:**



Assistant Professor **Computer Science**

University of Maryland, Baltimore County





2011 - 2015B.E. (Honours) **BITS Pilani** (Goa)



Temperature Mean: 10.4 °C Precipitation Sum: 970.1 mm





Tay + Go +





2016-2018: M.S. Carnegie Mellon University

2018-2023: Ph.D. Arizona State University

2023-present Assistant Professor University of Maryland Baltimore County

https://www.tejasgokhale.com/



Course Staff

Instructor: Tejas Gokhale Assistant Professor, CSEE



Wednesday 2:30 – 3:30 PM

ITE 214 gokhale@umbc.edu

TA: Ziwei Zhang Ph.D. Researcher, CSEE



Office Hours Monday 1:00 – 2:00 PM Tuesday 2:30 – 3:30 PM ITE 334 ziweiz1@umbc.edu

Class Website

- Assignments & Grades will be released on Blackboard

https://courses.cs.umbc.edu/graduate/675/

• This is your primary source for class material (slides, notes, readings, references, etc.)

Quick Round of Introductions

- 1. Name
- 2. Major (e.g. CS, CE, EE, etc.)
- 3. Level (e.g. BS, MS, Ph.D. etc.)
- 4. Why are you taking this class?

E, etc.) etc.)



THIS IS A NEURAL NETWORK.

IT MAKES MISTAKES. IT LEARNS FROM THEM.

BE LIKE A NEURAL NETWORK.



How Neural Network works? Neurons:







What this course is NOT about ...

- A "review" of the state-of-the-art: X
 - we will talk about some recent work, but the main goal is to learn fundamentals
- Applications-focused or domain-focused: X
 - CMSC 472/672: Computer Vision (next semester?)
 - CMSC 473/673: Natural Language Processing
- Broad introduction to "Al": CMSC 471/671: Artificial Intelligence X
- X
- "Hands-on" coding
- We expect you to be proficient in Python programming \bullet
- The TA will organize a PyTorch tutorial (during regular class hours) \bullet
- Homework and Projects: implementation. Lectures: mathematical concepts \bullet

What this course is about ...

- Mathematical Models of N.N. Architectures and N.N. Optimization Routines
- Supervised, Unsupervised, Self-Supervised Paradigms of Learning with N.N.
- Relationships between Deep Learning and "classical" models
- Generalization, Robustness, and Reliability issues

In short, this course expects:

mathematical rigor

interest in fundamentals

programming proficiency





Machine Learning: The Success Story IS "DEEP LEARNING" A REVOLUTION IN ARTIFICIAL INTELLIGENCE? Andrew Ng 🤣 Follow @AndrewYNg "Al is the new electricity!" Electricity transformed countless industries; AI will now do the same. 2016: The Year That Deep Learning Took Over t WHY DEEP LEARNING IS SUDDENLY **CHANGING YOUR LIFE**



R











Structure in the data ...

• 21st century:

massive increase in amount of digital data available from the internet, cameras, microphones, scientific measurements



NN/ Deep Learning has been revolutionary for finding structure in data

How "Revolutionary" ?

The 2024 physics laureates

The Nobel Prize in Physics 2024 was awarded to John J. Hopfield and Geoffrey Hinton "for foundational discoveries and inventions that enable machine learning with artificial neural networks."

John Hopfield created an associative memory that can store and reconstruct images and other types of patterns in data. Geoffrey Hinton invented a method that can autonomously find properties in data, and so perform tasks such as identifying specific elements in pictures.



John J. Hopfield and Geoffrey Hinton. Ill. Niklas Elmehed © Nobel Prize Outreach



Early efforts

- Hubel & Wiesel [60s]
 - Simple and Complex cells architecture

• Fukushima [70s] Neocognitron





Early Breakthroughs

• Deep Belief Networks, 2006 (Unsupervised)

Hinton, G. E., Osindero, S. and Teh, Y., A fast learning algorithm for deep belief nets, Neural Computation, 2006.



Theoretical Breakthrough:

Adding additional layers improves variational lower-bound.

Efficient Learning and Inference with multiple layers:

- Efficient greedy layer-by-layer learning learning algorithm.
- Inferring the states of the hidden variables in the top most layer is easy.

Breakthroughs: Convolutional Neural Networks

- Convolutional Networks for Vision
 - Krizhevsky, A., Sutskever, I. and Hinton, G. E., ImageNet Classification with Deep Convolutional Neural Networks, NIPS, 2012.



Breakthroughs: Generative Modeling

Conditional generative model P(zebra images | horse images) 0



Style Transfer





Input Image

Monet

4 years of progression on Faces



2014



2015



2016





Van Gogh



Reasoning & Planning

Language Understanding





Speech Recognition





Robotics







human

Perception and 3D Scene Understanding



Conversational Agents



Machine Translation

how do I say "hello world" in frenct	n			Ļ	٩
🔍 Al 🖾 Images 🧷 Shopping	Video	s 🗐 News	I More	Settings	Tools
About 2,660,000 results (0.71 seconds)	l.				
English - detected 🐱	÷	•	French	n -	
hello world	×	Bonjou	ır le m	onde	
*()	÷			•D	D

Medical Image Analysis

A HUNTINGTON DISEASE PATIENT





FIGURE 7 | A gray matter of MRI scans of an HD patient (A) and a healthy control (B).

Open in Goople Translate

Feedback

Recommendation Systems



Self Driving Cars





Language Models

Human: Hey, how are you doing?

AI: I'm good! What would you like to chat about? Human: Have you done any coding with Python?

AI: Yep! I've done a lot of Python coding as it is my favorite language. Human: Nice, it's my favorite too! What have you done with it?

AI: Oh, a lot. I have done everything from creating Python modules to creating microwebsites with it.

Human: What web framework do you use?

AI: I used to use Django, but it was too difficult for me. I have found Flask is a better option as it's lighter and simpler.

Human: Wow, I agree 100%. Have you used WebSocket at all? AI: Yes, I actually have written a chatbot using it! Human:

- Chatbots ۰
- Question-Answering Systems 0
- Information Retrieval ۰
- Code Generation

H-Index

where each citation is a nonnegative integer, write a function h index that outputs largest number h such that h

Example: Input: [3,0,6,1,4] Output: 3



Diffusion Models

Text-to-Image Synthesis on LAION. 1.4B Model.



Course Organization

Class Website

- This is your primary source for class material (slides, notes, readings, references, etc.)
- Assignments & Grades will be released on Blackboard

https://courses.cs.umbc.edu/graduate/675/

~~ List of Topics

Phase 1: INTRODUCTION

- Machine Learning Review (Regression, Classification, etc.) \bullet
- Feedforward Neural Networks, Backpropagation Algorithm
- Optimization and Regularization for Neural Networks •

Phase 2: ARCHITECTURES

- Convolutional Neural Networks Transformers
- Autoencoders
- Self-Supervised Learning
- Contrastive Learning
- Recurrent Neural Networks

• Prerequisites Review: Linear algebra, probability distributions, some basics of optimization

• Multimodal Learning Generative Adversarial Networks • Diffusion Models • Implicit Neural Representations

Phase 3: Challenges

- Evaluation
- Robustness
- Guarantees
- Tradeoffs



Grading

#THEGOODPLACE

OKAY, HERE WE GO.

NBC

Grading



There will be opportunities for extra credit (max 10% of total grade) Open-ended questions, writing assignments, creative assignments etc.

There is no Final Exam

3-5 assignments including conceptual questions, exercises, and 30%

Course project in groups of 3-4 (smaller or individual groups only 30%

3 S	15%
them for one lecture in the semester	5%
during class (4PM – 5PM)	20%



Homework

- Two major types of tasks: • Conceptual Questions (pen & paper) O Programming mini-projects in Python/Pytorch
- Conceptual:
 - Will be proofs / derivations
 - Points for steps (your thought process)
 - Show all of your work when answering
- Programming:

 - analysis and conclusions drawn from successful as well as failure cases.

When the teacher says the homework in one night



• Most will be open-ended (exploratory). No right or wrong answers! Do your best! Some tasks will result in bad results (by design). Evaluation will be based on your

Quizzes (in class)

- Multiple-choice / True-False / "draw a diagram" / short answer questions about previous lecture(s)
- Take notes during class (in your favorite format)
 - The very act of writing stuff down while you hear something new really really helps with information retention
- We will consider your "top k" grades out of "q" quizzes, with $q k \ge 2$
 - E.g. q = 12; k = 10
 - There will be no make-up quizzes if you miss a class

Scribing

- Scribing == Taking high-quality detailed notes during a lecture and typesetting them using Overleaf/LaTeX (CVPR template is available on the Class Website).
- All students are required to scribe at least **once** during the semester.
- You can sign-up for your preferred lectures (signup sheet: QR code)
- Due Dates:
 - Notes for Monday lectures are due before class next Monday
 - Notes for Wednesday lectures are due before class next Wednesday
- Submit notes by emailing both me and the TA with the title: [CMSC NN] Scribing <DATE>



Extra Credit

- HW will have some optional problems (but for extra credit!)

 Open ended questions or tasks where your creativity is required
 We may showcase best outcomes of these in class
- Extra credit is capped at 10%
 5 extra points and 91 in the rest of the class
 → your final grade is 96
 18 extra points and 91 in the rest of the class
 → your final grade is 101

Project

- Intention: learning and coherently writing up your result.
- **Expectation**: A simple original idea that you can *describe clearly*, real-world problem(s)
- How?

• Write code, run it on some data, make some figures/tables to present results o read relevant background papers, collect some references o write a report describing your model, algorithm, and results.

To give you an opportunity to do original research in deep

relate the idea to existing work, *implement and test* the idea on some



Project



Project



Project Topic

- Pick from our list
- Choose your own *
 - needs approval from Tejas



02/11 04/04 05/16

Group Formation (3) Midterm Update (Video) (5) Submit Slides (PDF)

Each student will be graded separately

Group Size: 3 to 4 students

Declare group by March 1

PhD students: can work alone (approval granted on a case-by-case basis after consultation

Deliverables

(2) Project Proposal 02/28 (4) Final Presentation (in class) Last week (6) Submit Report (8 pg CVPR format) 05/16





Deadlines & Late Days

- Late Days: each student will get 10 late days (for projects and HW only) • Each late day extends the deadline by 24 hours

 - Using a late day does not influence the grade.
 - Late submissions turned in after all 10 late days have been exhausted will receive 0 points
- Projects: if a group uses 1 late day \rightarrow 1 late day deducted from all group members!
- we will select your best 10 scores out of 10 + d. • Quizzes: No make up quizzes.
- Late days are provided to help you deal with illness or injury, emergencies, paper deadlines, conference travel, interviews, computer problems, or other personal reasons.

Do not use the late days as an excuse for procrastination \odot





Attending Classes

- Attendance is mandatory
 - Exceptions: health reasons and personal emergencies.
 - without your attendance and attention in class.
- Perks:
 - Classes have (relatively easy) quizzes.
 - teammates from 2017!



- Impossible to do a good job at homework, quizzes, and midterm (70% of your grade)

- Meet your future project team – new friends – I'm still in touch with my NN project

-Do you really want to miss these memes?



- Presentations, Survey Papers, Quizzes must be done independently.
- Do not plagiarize. Consequences will not be pleasant.
- Do not use "Al" assistants for any part of any assignment. Consequences will not be pleasant.
- Familiarize yourself with UMBC policy on plagiarism and other forms of cheating: https://academicconduct.umbc.edu/resources-for-students/
- Read the syllabus for consequences of academic integrity violations.



Use of AI Assistants 3.4

This is a class that teaches you how to design AI systems. Using AI systems to do class work is therefore an obvious form of cheating. The use of AI systems or AI assistants (including but not limited to language models such as ChatGPT) for completing any part of assignments in this class is considered cheating. There are no exceptions to this rule.

Good Practices 3.6

If the integrity of your work in this course is challenged, you are responsible for demonstrating proof that the work submitted is your own. A good starting point is to enable versioning/tracking in Google Docs, Word, Pages, or other software so that your writing activities/progress during the semester can be logged if necessary. Keeping copies of research notes, scribbles, and related material may be helpful, too.

Viva or Oral Defense of Flagged Submissions $\mathbf{3.7}$

To ensure academic and professional integrity, I reserve the right to hold a one-on-one oral viva (defense) of submissions deemed questionable, to determine your knowledge and mastery of the topic/resources versus the material submitted. Failing that viva will result in an 'F' on the assignment and an Academic Integrity violation report filed with the Graduate School.

Penalties 3.8

Academic misconduct could result in disciplinary action that may include, but is not limited to, suspension or dismissal. The absolute minimum penalty for a first offense of academic dishonesty in this course is a grade of zero on the assignment and a one-letter-grade reduction in the final class grade. However, depending on the nature of the offense, the penalty may be more severe, including but not limited to an F for the course, suspension, or expulsion. The minimum penalty for a second offense of academic dishonesty is an F for the course without possibility of dropping, but may be more severe.

I DON'T ALWAYS CARE ABOUT MY GRADE...

BUT WHEN I DO IT'S THE END OF THE SEMESTER AND EVEN THOUGH I DIDN'T DO ALL THE ASSIGNMENTS, I'LL ASK FOR EXTRA CREDIT NOW.

Seek Help Early!

Help us help you.

Homework 0 (Optional)

- This is optional. Due next Wednesday (03/05)
- An opportunity for you to self-evaluate whether you have the pre-requisites for this class (linear algebra, probability, stats, etc.)

NO

• Grading:

You should either:

(1) Brush up on pre-reqs (resources on next slide / website)

(2) Consider dropping the class

Recommended Background

- Linear algebra + calculus + geometry + prob/stats (required)

 475/675 should not be your first introduction to these topics
 Without these tools, you are likely to struggle with the course.
- Python programming with numerical libraries like numpy o TA will give a tutorial on computer vision with PyTorch
- Useful resources to brush up on these topics
 <u>deeplearningbook.org/contents/linear_algebra.html</u>
 - o https://www.deeplearningbook.org/slides/02_linear_algebra.pdf
 - o deeplearningbook.org/contents/prob.html
 - o https://www.deeplearningbook.org/slides/03_prob.pdf

Readings

Topic-specific reading will be provided (pdf) Other useful resources:

www.deeplearningbook.org/

Free download

https://www.bishopbook.com/

Free download

https://link.springer.com/boo k/10.1007/978-3-030-18114-7

Free download via UMBC

475 (undergrad) vs 675 (grad)

- We are confident that 475 students are at least as capable than their 675 classmates
- No difference in class materials, exams, quizzes, majority of homework
- Homework: additional parts for 675
- Grad projects will be evaluated at a higher standard

in the same class

475 (undergrad) vs 675 (grad)

Main difference: projects (scope and novelty)

- Projects will be graded in terms of "relative growth" • You may have previous research experience
 - You may be taking this class to get research experience
- Grad projects:
 - Original & unique research hypothesis with a potential for publication
- Undergrads projects can be:
 - Original & unique research hypothesis with a potential for publication
 - Working on an idea that we provide (i.e. you get to skip 'ideation'')
 - Innovative applications or combination of existing work

in the same class

FAQ: I'm waitlisted – what can I do?

I'm sorry this is happening to you. Thanks for your patience
 I (like you) am also bound by UMBC's waitlist policy.

01/31/2025	Waitlist Deadline	Ι
02/03/2025	Waitlists Deactivated	V
02/07/2025	Schedule Adjustment Deadline	I I I

- If you're still interested AND are on the waitlist, please see me AFTER class on 01/29. No promises, but I'll try
- 3. Consider CMSC 678 (Machine Learning) as an alternative.

- Last day to add yourself to a waitlist for a course
- Waitlists are deactivated and purged
- Last day to make changes to your schedule
- Last day to change grade method
- Last day to drop a course without a W grade

FAQ: Access to Practice Quizzes and Midterm?

- I am revamping UMBC's neural networks course • The course hasn't been offered for more than a decade.
- Therefore, no practice / past midterms or quizzes are available!

• This is a graduate-level class – we will test your concepts (and not your ability to do fast arithmetic / memorization) • Make sure you understand the concepts Read to the reference books / materials

FAQ: Can I join your research lab?

- The Cognitive Vision Group (CVG) broadly works on "conceptual characterization of visual scenes" with some goals including:
 - o interpretation of visual data in presence of incomplete information,
 - recognizing and adapting to novelty and variations,
 - o leveraging external knowledge and reasoning modules to generalize to new contexts, domains, environments, and tasks,
 - o acquiring visual knowledge and communicating it to other machines and humans.
- Joining (See FAQ/note on my website)

• Take this class and talk to me during office hours about your interests

o https://www.tejasgokhale.com/docs/cvg_starter_pack.pdf

Other Questions?

Scribing / Project Team Signup Sheet

Class Website

