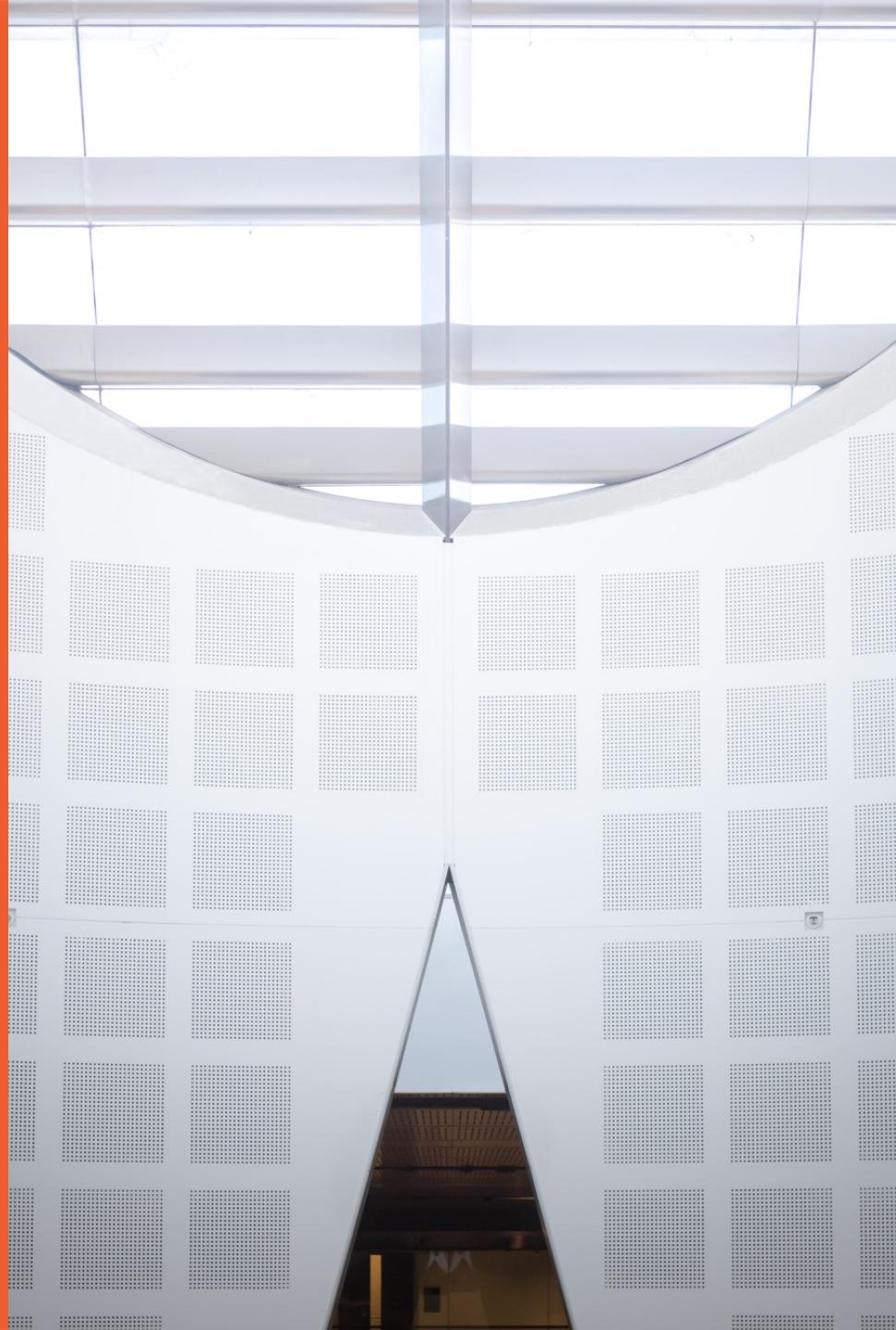


Deep Learning

COMP 5329

Dr Chang Xu

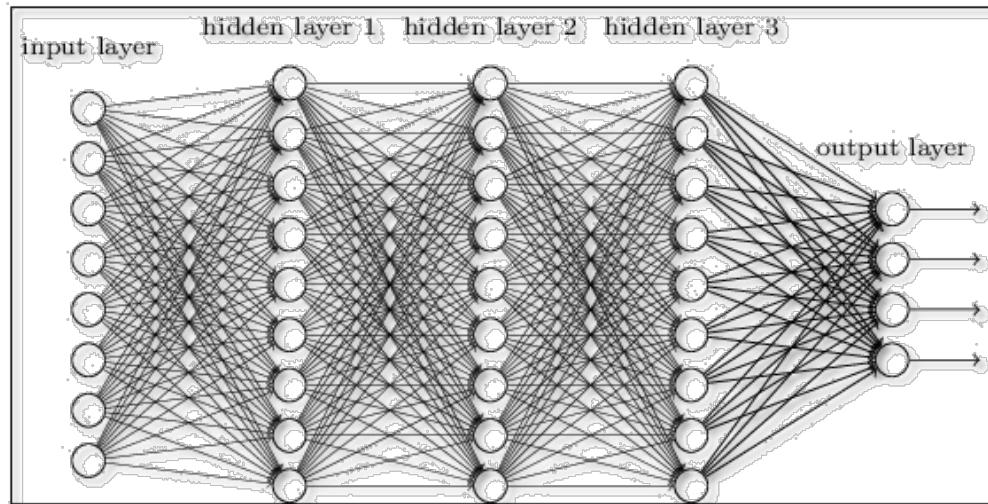
c.xu@sydney.edu.au
School of Computer Science



What is Deep Learning?

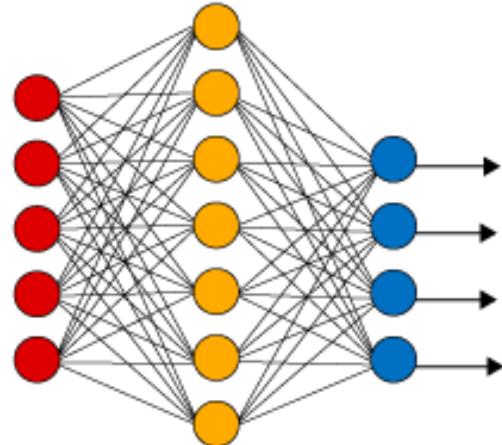
The short answers

1. ‘Deep Learning’ means using a **neural network** with several layers of nodes between input and output
2. the series of layers between input & output to do feature identification and processing in a series of stages, just as our brains seem to.

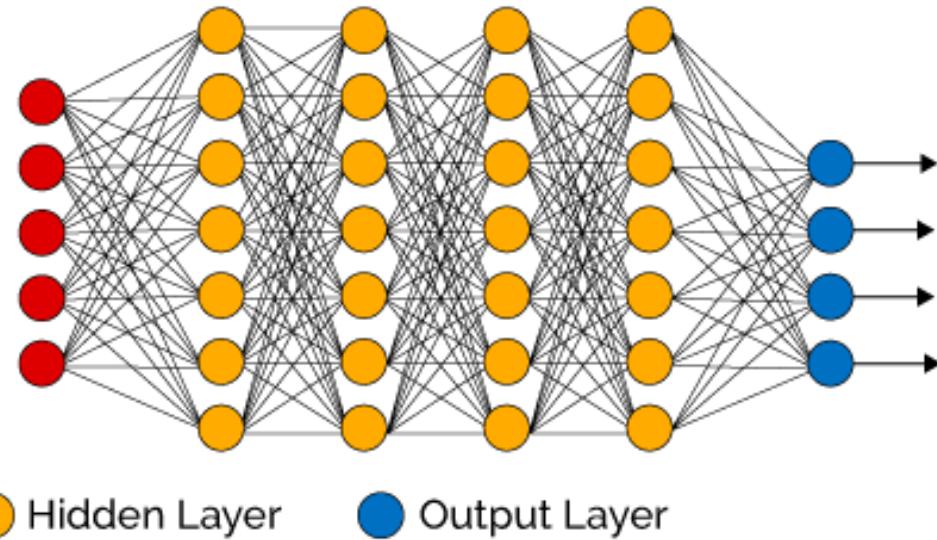


What is Deep Learning?

Simple Neural Network



Deep Learning Neural Network

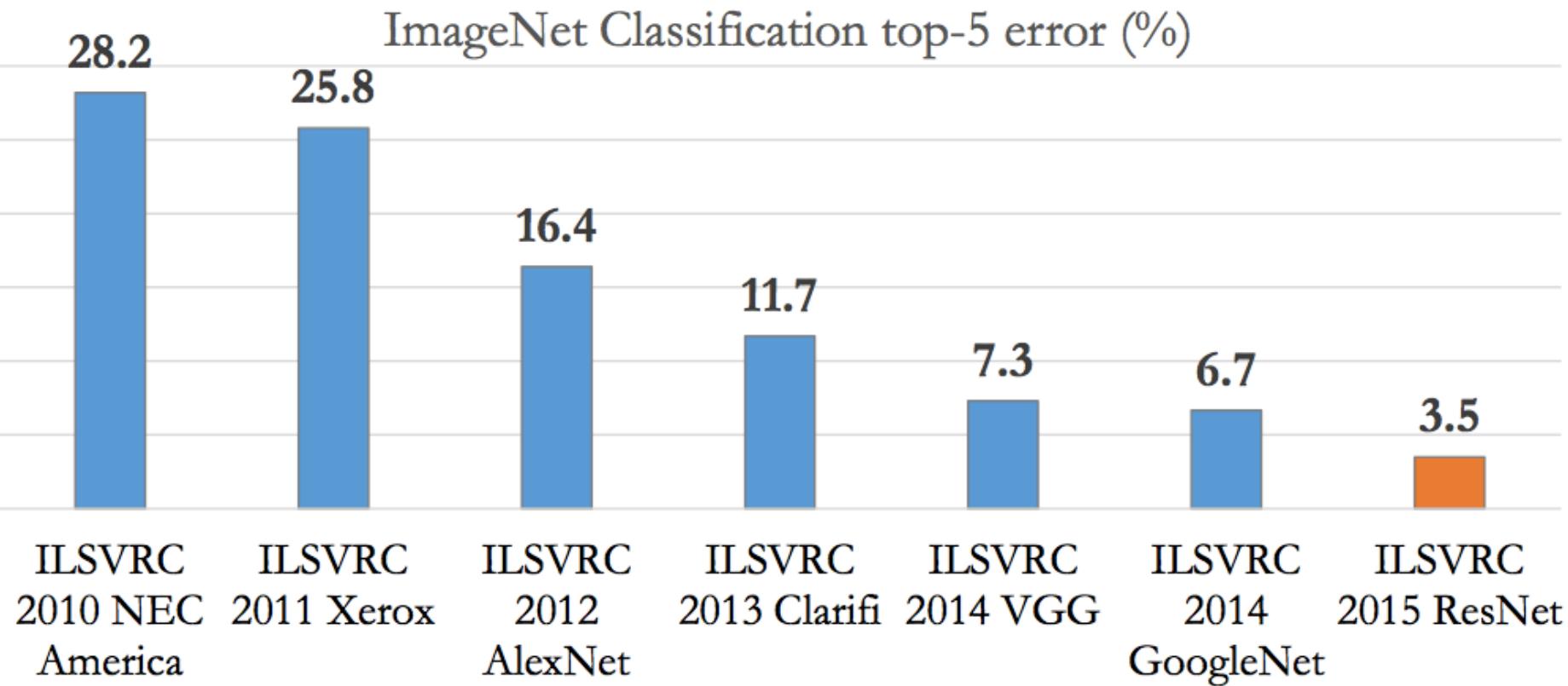


We have always had good algorithms for learning the weights in networks with 1 hidden layer;

But these algorithms are not good at learning the weights for networks with more hidden layers

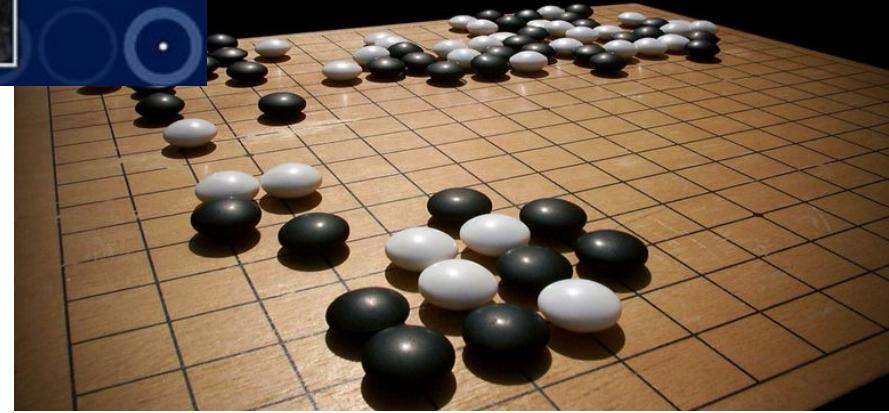
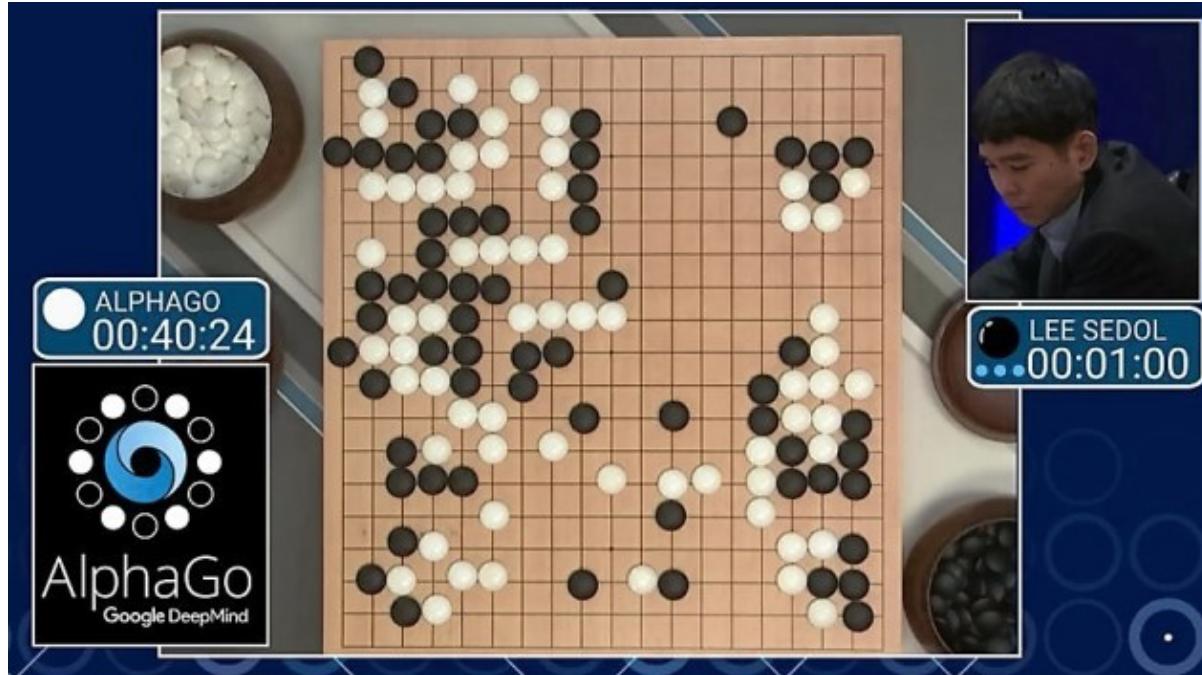
Image credit to becominghuman.ai

Why to Study Deep Learning?



Human: 5.1% Top-5 error rate.

Why to Study Deep Learning?



Google Deep Mind

AlphaGO defeats world champion

Why to Study Deep Learning?

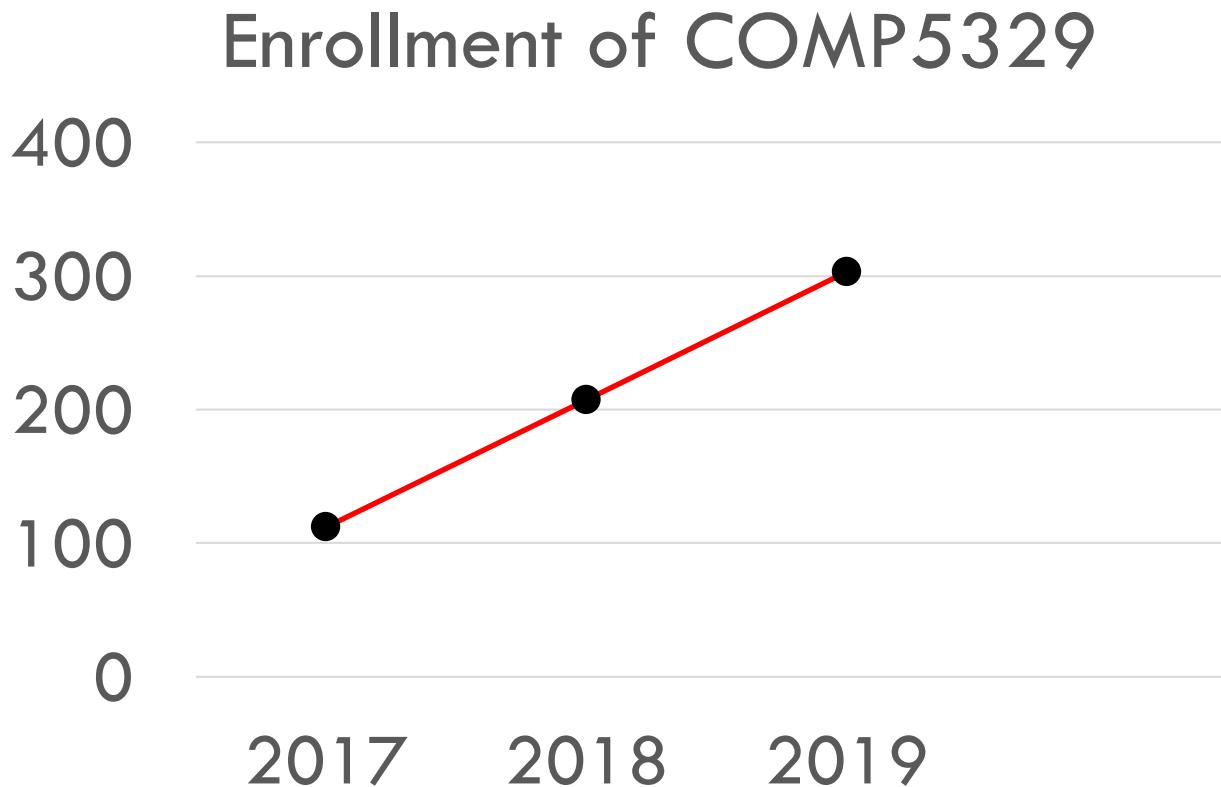


What to Learn?

Week	Topic
1	Introduction to Deep Learning
2	Multilayer Neural Network
3	Optimization for Deep Models
4	Regularization for Deep Models
5	Quiz
6	Convolutional Neural Networks
7	Holiday
8	Neural Network Architectures
9	Recurrent Neural Network and LSTM
10	Graph Neural Networks
11	Deep Learning Applications
12	Deep Generative Models
13	Review

Call for a “student representative group”

- It was a volunteering activity for the students. Total number of students in the group is limited to 5.



Call for a “student representative group”

- It is a volunteering activity for the students. Total number of students in the group is limited to 5.
- The group meets with the teaching team twice; in weeks 3 and 10.
- No formal feedback form or interview is provided rather they are informal meetings to probe how the students feel throughout the course and what are the main concerns of the bulk of the class who cannot or do not want to communicate with the teaching team directly.

* We expect diverse background of members in the group.

* Make an application at <https://bit.ly/2ThR3nj>

Places

- **Lecture: every Friday, 18:00 – 20:00**
Carslaw Lecture Theatre 157
- **Consultation: Friday, 15:00-16:00 316, Level 3, J12**
- **Online Consultation: Friday, 14:00-15:00.**
* This is mainly for off-campus students who are influenced by Australia's coronavirus travel ban. Please book a slot via <https://bit.ly/2P5vhSp>
- **Teaching Assistant: Shumin Kong <shumin.kong@sydney.edu.au>**

Labs : every Friday 20:00 – 21:00 (from the 2nd week)

See Unit Information on Canvas:

School of Information Technologies Laboratory 114	https://uni-sydney.zoom.us/j/6131711717?pwd=K3lENldHaURNRUZsWDE1M0J3YVNLZz09
School of Information Technologies Laboratory 115	https://uni-sydney.zoom.us/j/879937958?pwd=YlhVaisyVU9rMnRXbUMrNUhrOEQrUT09
School of Information Technologies Laboratory 116	https://uni-sydney.zoom.us/j/534177774?pwd=YTF0U3hldlFzTGJKcFA5RFIzYmVhdz09
School of Information Technologies Laboratory 117	https://uni-sydney.zoom.us/j/624698524?pwd=QnozWGh3djJHMVQvYIFHV2dtQ00rUT09
School of Information Technologies Laboratory 118	https://uni-sydney.zoom.us/j/3190594343?pwd=TkpFL3FNSWtuZVZ0TXc5cXNKTURYUT09
School of Information Technologies Laboratory 130A	https://uni-sydney.zoom.us/j/5511759961?pwd=emVXTnluOEk5TjBoR1Z6TDlxY3NhQT09
School of Information Technologies Laboratory 130B	https://uni-sydney.zoom.us/j/2660685272?pwd=aFj0MmFHdERmZXdtTGRMZWdmaGIVQT09
Madsen Computer Lab 300	https://uni-sydney.zoom.us/j/6078603560?pwd=ck1jZUICM1QwL2FiVDViaGwxR3NRQT09
Madsen Computer Lab 211	
Madsen Computer Lab 226	
Madsen Computer Lab 302	
CS Lab 457	
ABS Interactive Learning Studio 1090	https://uni-sydney.zoom.us/j/9541660210?pwd=MEdoa3ltMTZXbWhyY25NODA4ZHpmdz09

1. Review the lecture slides (around 20 mins)
2. Q&A

* Tutors will use zoom for tutorials in labs.

Expectations

- Students attend scheduled classes, and devote an *extra* 6-9 hrs per week
 - doing assessments
 - preparing and reviewing for classes
 - revising and integrating the ideas
 - practice and self-assess
- Students are responsible learners
 - Participate in classes, constructively
 - Respect for one another (criticize ideas, not people)
 - Humility: none of us knows it all; each of us knows valuable things
 - Check Canvas site at least once a week!
 - Notify academics whenever there are difficulties
 - Notify group partners honestly and promptly about difficulties

Special Consideration (University policy)

- If your performance on assessments is affected by illness or misadventure
- Follow proper bureaucratic procedures
 - Have professional practitioner sign special USyd form
 - Submit application for special consideration online, upload scans
 - Note you have only a quite short deadline for applying
 - http://sydney.edu.au/current_students/special_consideration/
- Also, notify coordinator by email as soon as *anything begins to go wrong*
- There is a similar process if you need special arrangements eg for religious observance, military service, representative sports

Late assessments in COMP5329

- Suppose you hand in work after the deadline:
- If you have not been granted special consideration or arrangements
 - A penalty of 5% of the maximum marks will be taken per day (or part) late. After ten days, you will be awarded a mark of zero.
- e.g. *If an assignment is worth 40% of the final mark and you are one hour late submitting, then the maximum marks possible would be 38%.*
- e.g. *If an assignment is worth 40% of the final mark and you are 28 hours late submitting, then the maximum marks possible marks would be 36%.*
- Warning: submission sites get very slow near deadlines
- Submit early; you can resubmit if there is time before the deadline

Academic Integrity (University policy)

- “The University of Sydney is unequivocally opposed to, and intolerant of, plagiarism and academic dishonesty.
 - Academic dishonesty means seeking to obtain or obtaining academic advantage for oneself or for others (including in the assessment or publication of work) by dishonest or unfair means.
 - Plagiarism means presenting another person’s work as one’s own work by presenting, copying or reproducing it without appropriate acknowledgement of the source.” [from site below]
- <http://sydney.edu.au/elearning/student/EI/index.shtml>
- Submitted work is compared against other work (from students, the internet, etc)
 - Turnitin for textual tasks (through Canvas), other systems for code
- Penalties for academic dishonesty or plagiarism can be severe
- Complete self-education AHEM1001 (required to pass INFOxxxx)

COMP5329: Resources

- Canvas: <https://canvas.sydney.edu.au/>
 - Login using Unikey and password
 - Link to Units website: <https://sydney.edu.au/units/>
 - Official schedule, list of learning outcomes, etc
 - Copies of slides
 - Lab instructions
 - Assignment instructions
 - Lecture videos
 - *Submit official assignment work here;*
 - see your grades; etc
- Discussion forum: on edstem

COMP5329 Reference book

Goodfellow I J, Bengio Y, Courville A, *Deep Learning*.
MIT Press, 2016.

LeCun Y, Bengio Y, Hinton G. Deep learning[J]. nature, 2015, 521(7553): 436-444.

- **We will use PyTorch in labs.** PyTorch documentation can be found at <https://pytorch.org/docs/stable/index.html>

COMP5329 Reference book

Applied Math and Machine Learning Basics:

2 Linear Algebra	27	3.6 The Chain Rule of Conditional Probabilities	52
2.1 Scalars, Vectors, Matrices and Tensors	27	3.7 Independence and Conditional Independence	52
2.2 Multiplying Matrices and Vectors	30	3.8 Expectation, Variance, and Covariance	53
2.3 Identity and Inverse Matrices	31	3.9 Information Theory	54
2.4 Linear Dependence, Span, and Rank	32	3.10 Common Probability Distributions	57
2.5 Norms	34	3.11 Useful Properties of Common Functions	62
2.6 Special Kinds of Matrices and Vectors	35	3.12 Bayes' Rule	64
2.7 Eigendecomposition	37	3.13 Technical Details of Continuous Variables	64
2.8 Singular Value Decomposition	39	3.14 Structured Probabilistic Models	65
2.9 The Moore-Penrose Pseudoinverse	40	3.15 Example: Naive Bayes	68
2.10 The Trace Operator	41		
2.11 Determinant	42		
2.12 Example: Principal Components Analysis	42		
3 Probability and Information Theory	46	4 Numerical Computation	74
3.1 Why Probability?	46	4.1 Overflow and Underflow	74
3.2 Random Variables	48	4.2 Poor Conditioning	75
3.3 Probability Distributions	49	4.3 Gradient-Based Optimization	76
3.4 Marginal Probability	51	4.4 Constrained Optimization	85
3.5 Conditional Probability	51	4.5 Example: Linear Least Squares	87
5 Machine Learning Basics	89		
5.1 Learning Algorithms	89		
5.2 Example: Linear Regression	97		
5.3 Generalization, Capacity, Overfitting and Underfitting	99		
5.4 The No Free Lunch Theorem	104		
5.5 Regularization	106		
5.6 Hyperparameters, Validation Sets and Cross-Validation	108		
5.7 Estimators, Bias, and Variance	110		
5.8 Maximum Likelihood Estimation	118		
5.9 Bayesian Statistics and Prior Probability Distributions	121		
5.10 Supervised Learning	128		
5.11 Unsupervised Learning	131		
5.12 Weakly Supervised Learning	134		
5.13 The Curse of Dimensionality and Statistical Limitations of Local Generalization	135		

Goodfellow I J, Bengio Y, Courville A, *Deep Learning*. MIT Press, 2016.

Assessment Overview

- **Quiz: 10%**

- Week 5 (27-March) in-lab, 20:00 - 21:00
 - Individual on Canvas

- **Assignment 1: 15%**

- Week-9 (1-May) 18:00
 - Groups of 2 or 3 students
 - Classification task

- **Assignment 2: 15%**

- Week 13 (29-May), 18:00
 - Groups of 2 or 3 students for Competition Track
 - Groups of 2 or 3 students for Research Track

- **Final exam: 60%**

- June 2020 (date to be defined)

Call for research track abstracts for Assignment 2

(see Canvas)

- This research track calls for brave new ideas on deep learning. In this track, you are encouraged to propose and investigate new algorithms or problems in deep learning.
- You must not use the project (e.g. your capstone or SSP project) that you have already done or are currently doing in other units to participate in this track.
- An extended abstract (up to one page) to highlight the importance and novelty of your research problem, the major idea of your candidate solution, the feasibility of the proposed research, and the expected experimental achievements (if applicable).
- 10 groups will be selected.
- Abstract Submission Deadline: Week 5 (27 March, 18:00)
Abstract Decision: Week 6 (3 April)

Coronavirus (COVID-19)

- We can protect ourselves by following good hygiene, for example:
 - **Washing our hands regularly**, for at least 20 seconds with soap and water, or by using an alcohol-based hand rub
 - **Applying good cough etiquette** - covering your mouth when coughing and sneezing with a tissue or a flexed elbow
 - **Avoiding close contact with anyone with cold or flu symptoms**, e.g. fever, cough, runny nose or shortness of breath

Coronavirus (COVID-19)

- **All staff and students who have cold or flu symptoms should isolate themselves from others**
- If you have a non-infectious condition such as asthma or hayfever please let your teacher and classmates know
- If you are otherwise unwell with cold or flu symptoms please excuse yourself from this class and **we will support you to continue the work remotely**
- Make sure you read the information on **special consideration in the unit outline.**

Coronavirus (COVID-19)

- The University is following advice from the government and related public health authorities
 - For the latest information, see the [advice on the University website](#)
- It's important to remember that the University is a **respectful environment and that racism won't be tolerated** in the classroom, online or on campus
 - [Student video](#)
- Please take care of each other and yourselves and if you need support reach out to your unit coordinator or the health and wellbeing area of the [Current Student website](#)

Coronavirus (COVID-19)

- The risk of contracting coronavirus (COVID-19) remains very low. This may change and the University is still monitoring the situation closely.
 - For the latest information, see the [advice on the University website](#)
- Remember good hygiene practices: -
 - Frequent handwashing
 - Cough etiquette
 - Cough or sneeze into a tissue or your flexed elbow.

Coronavirus (COVID-19)

- If you have a known medical condition that is not infectious, but have respiratory symptoms, such as asthma or hayfever, please be open with the people around you, they will be understanding
- If you are otherwise unwell or exhibiting respiratory symptoms (e.g. fever, cough, runny nose) we ask that you please exclude yourself from the class (even if you are wearing a surgical mask) and we will support you to continue the work remotely or bring you up to speed asap
- Make sure you read the information on special consideration in the unit outline

Coronavirus (COVID-19)

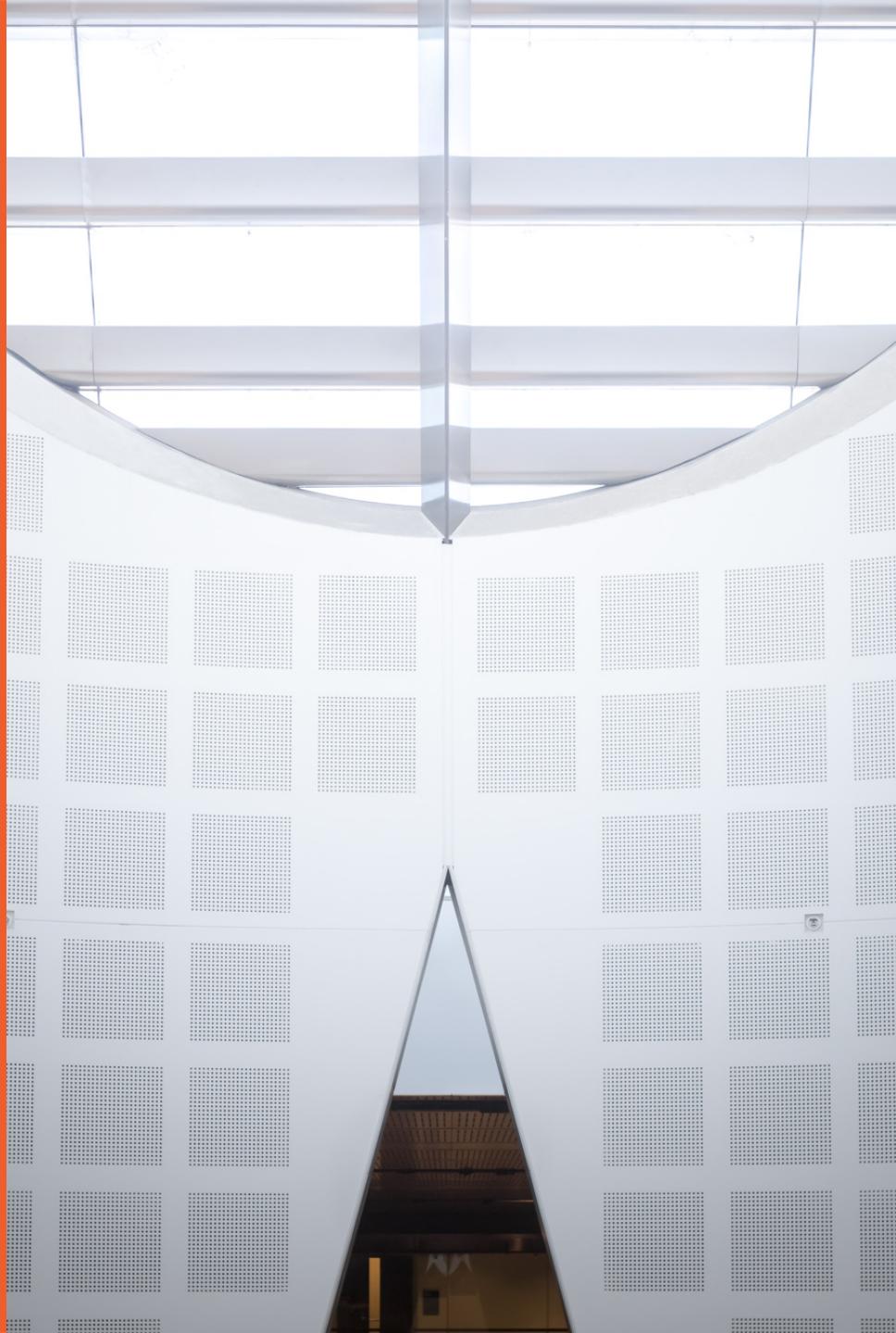
- The University is a respectful environment and that racism won't be tolerated in the classroom, online or on campus
 - [Student video](#)

WHS Induction

School of Computer Science



THE UNIVERSITY OF
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General Housekeeping – Use of Labs

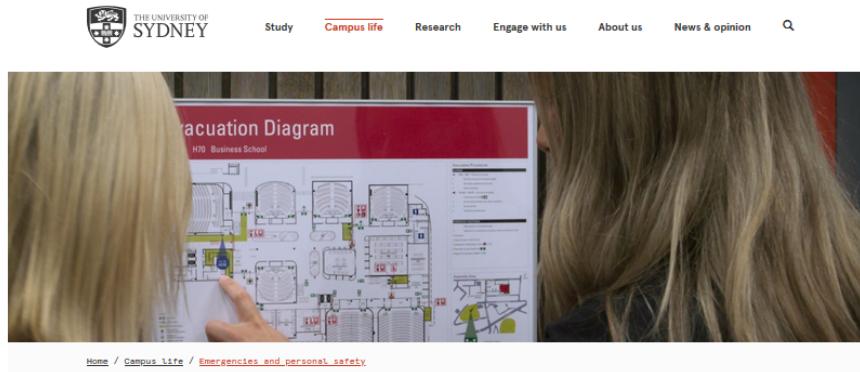
- Keep work area clean and orderly
- Remove trip hazards around desk area
- No food and drink near machines
- No smoking permitted within University buildings
- Do not unplug or move equipment without permission



EMERGENCIES – Be prepared



<https://sydney.edu.au/campus-life/safety-security.html>



← Home

← Campus life

Accommodation

What's on

Health, wellbeing
and success

Clubs and societies

Getting to campus

Sports and fitness

Food, shops and bars

Emergencies and
personal safety

Maps and locations

Life in Sydney

University_

Emergencies and personal safety

Procedures to follow in the case of an emergency

We're committed to keeping our students, staff and visitors safe.

Emergencies can occur at any time for a variety of reasons. Be prepared to respond independently, particularly if working after hours. Watch our [video on emergency procedures](#) and read our [tips for staying safe on campus](#).

In an emergency

1. Dial triple zero (000)

2. Call Campus Security on 9351 3333

Counselling, support and reporting services

If you have witnessed or been involved in a critical incident, whether on or off campus, and would like to talk to a counsellor:

Students should contact the University's [Counselling and Psychological Services](#) on 8627 8433 or 8627 8437 (9am to 5pm, Monday to Friday).

Share

Safer
communities
on campus

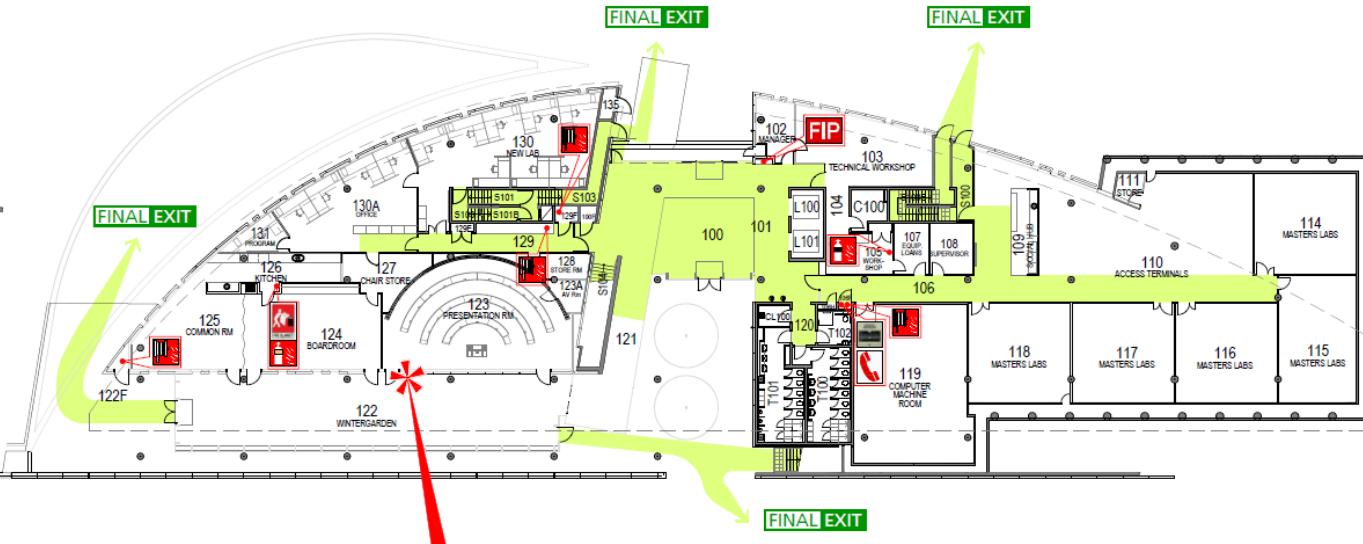
Our commitment to
building a safer campus

Emergency
alerts

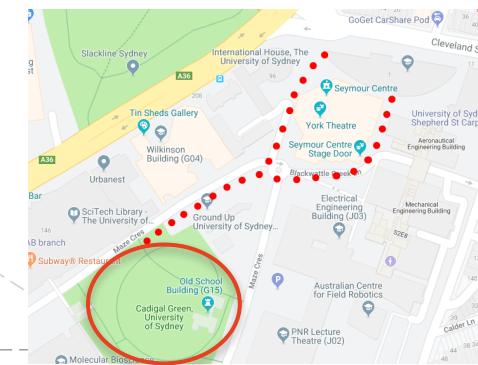
Find out about our
system

EMERGENCIES

WHERE IS YOUR CLOSEST SAFE EXIT ?



**Assembly Area:
Cadigal Green**



EMERGENCIES

Evacuation Procedures

ALARMS



BEEP... BEEP...

Prepare to evacuate

1. Check for any signs of immediate danger.
2. Shut Down equipment / processes.
3. Collect any nearby personal items.



WHOOP... WHOOP...

Evacuate the building

1. Follow the **EXIT** exit signs.
2. Escort visitors & those who require assistance.
3. DO NOT use lifts.
4. Proceed to the assembly area.

EMERGENCY RESPONSE

1. Warn anyone in immediate danger.
2. Fight the fire or contain the emergency, if safe & trained to do so.
If necessary...
3. Close the door, if safe to do so.
4. Activate the **"Break Glass"** Alarm  or 
5. Evacuate via your closest safe exit. 

6. Report the emergency to 0-000 & 9351-3333

MEDICAL EMERGENCY

- If a person is seriously ill/injured:

1. call an ambulance 0-000
2. notify the closest Nominated First Aid Officer

If unconscious— send for Automated External Defibrillator (AED)
AED locations.

NEAREST to CS Building (J12)

- Electrical Engineering Building, L2 (ground) near lifts
- Seymour Centre, left of box office
- Carried by all Security Patrol vehicles



3. call Security - 9351-3333
4. Facilitate the arrival of Ambulance Staff (via Security)



Nearest Medical Facility

University Health Service in Level 3, Wentworth Building

First Aid kit – SIT Building (J12)
kitchen area adjacent to Lab 110

School of Computer Science Safety Contacts

CHIEF WARDEN

Greg Ryan
Level 1W 103
9351 4360
0411 406 322



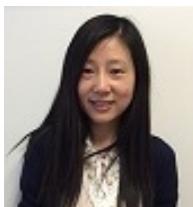
FIRST AID OFFICERS



Julia Ashworth
Level 2E Reception
9351 3423



Will Calleja
Level 1W 103
9036 9706
0422 001 964



Katie Yang
Level 2E 237
9351 4918

**Orally REPORT all
INCIDENTS
& HAZARDS
to your SUPERVISOR**

OR

Undergraduates: to Katie Yang
9351 4918

Coursework

Postgraduates: to Cecille Faraizi
9351 6060
or Keiko Narushima
8627 0872

CS School
Manager:

Priyanka Magotra
8627 4295

Assistance

- There are a wide range of support services available for students: <https://sydney.edu.au/campus-life/health-wellbeing-success.html>
- Please make contact, and get help
- You are not required to tell anyone else about this
- If you are willing to inform the unit coordinator, they may be able to work with other support to reduce the impact on this unit
 - eg provide advice on which tasks are most significant

DISABILITY SERVICES

Do you have a disability?

- You may not think of yourself as having a 'disability' but the definition under the **Disability Discrimination Act** is broad and includes temporary or chronic medical conditions, physical or sensory disabilities, psychological conditions and learning disabilities.
- The types of disabilities we see include:
- anxiety, arthritis, asthma, asperger's disorder, ADHD, bipolar disorder, broken bones, cancer, cerebral palsy, chronic fatigue syndrome, crohn's disease, cystic fibrosis, depression, diabetes, dyslexia, epilepsy, hearing impairment, learning disability, mobility impairment, multiple sclerosis, post traumatic stress, schizophrenia , vision impairment, and much more.
- Students needing assistance must register with Disability Services –
 - it is advisable to do this as early as possible.
- <http://sydney.edu.au/study/academic-support/disability-support.html>

Do you have a disability?

You may not think of yourself as having a 'disability' but the definition under the **Disability Discrimination Act**

(1992) is broad and includes temporary or chronic medical conditions, physical or sensory disabilities, psychological conditions and learning disabilities.

The types of disabilities we see include:

Anxiety // Arthritis // Asthma // Autism // ADHD

Bipolar disorder // Broken bones // Cancer

Cerebral palsy // Chronic fatigue syndrome

Crohn's disease // Cystic fibrosis // Depression

Diabetes // Dyslexia // Epilepsy // Hearing impairment //

Learning disability // Mobility impairment // Multiple sclerosis // Post-traumatic stress // Schizophrenia //

Vision impairment
and much more.

Students needing assistance must register with Disability Services. It is advisable to do this as early as possible. Please contact us or review our website to find out more.



THE UNIVERSITY OF
SYDNEY

Disability Services Office
sydney.edu.au/disability
02-8627-8422



Other support

- Learning support
 - <http://sydney.edu.au/study/academic-support/learning-support.html>
- International students
 - <http://sydney.edu.au/study/academic-support/support-for-international-students.html>
- Aboriginal and Torres Strait Islanders
 - <http://sydney.edu.au/study/academic-support/aboriginal-and-torres-strait-islander-support.html>
- Student organization (can represent you in academic appeals etc)
 - <http://srcusyd.net.au/> or <http://www.supra.net.au/>
- Please make contact, and get help
- You are not required to tell anyone else about this
- If you are willing to inform the unit coordinator, they may be able to work with other support to reduce the impact on this unit
 - eg provide advice on which tasks are most significant

Advice

- Metacognition
 - Pay attention to the learning outcomes in Canvas
 - Self-check that you are achieving each one
 - Think how each assessment task relates to these
- Time management
 - Watch the due dates
 - Start work early, submit early
- Networking and community-formation
 - Make friends and discuss ideas with them
 - Know your tutor, lecturer, coordinator
 - Keep them informed, especially if you fall behind
 - Don't wait to get help
- Enjoy the learning!