



THE UNIVERSITY
of ADELAIDE



Annual Report
2019

AUSTRALIAN INSTITUTE FOR MACHINE LEARNING

adelaide.edu.au/aiml

OUR VISION

TO BE GLOBAL LEADERS IN MACHINE LEARNING RESEARCH, AND HIGH-IMPACT RESEARCH TRANSLATION.

OUR MISSION

RESEARCH EXCELLENCE IN MACHINE LEARNING, ARTIFICIAL INTELLIGENCE AND COMPUTER VISION.



RANKED IN THE TOP 3 OF GLOBAL RESEARCH ORGANISATIONS FOR COMPUTER VISION

01

RANKED NUMBER ONE IN AI AND MACHINE LEARNING IN AUSTRALIA.



THE LARGEST MACHINE LEARNING GROUP IN THE COUNTRY

ABOUT THE INSTITUTE

The Australian Institute for Machine Learning (AIML) is Australia's first university-based institute dedicated to research in machine learning.

AIML launched in early 2018 with co-investment from the South Australian Government and the University of Adelaide.

Built on the success of the Australian Centre for Visual Technologies, AIML has taken high-impact applied research to another level, becoming a world-leader in applying machine learning methodologies.

With over 120 researchers, AIML is the largest University-based research group in machine learning in Australia. Our impact partners include experts in many fields including agriculture, space, medicine, transport defense, cybersecurity and advanced manufacturing.

Machine learning underpins the business models of the largest corporations and has the potential to deliver great social, economic and environmental benefits.

Our Institute makes an important national and international contribution to pushing the boundaries of what machine learning can do, and how that can be applied to almost every aspect of our lives.

At AIML we collaborate with world-leading companies to develop high-tech products and solutions to everyday problems.

THE FUTURE OF WORK IS AI

The LinkedIn 2020 Emerging Jobs Report says AI has arrived.

“All of Australia’s top five emerging jobs feature automation or Artificial Intelligence (AI) skills.”

“AI is spreading to all organisational areas, from IT to finance and marketing. AI may not be fully integrated into everything yet, but the trajectory is clear.”

Top five emerging jobs

01

Artificial Intelligence specialist

02

Cybersecurity specialist

03

Marketing Automation Specialist

04

Robotics Engineer

05

Site Reliability Engineer

AIML capabilities

- Machine learning
- Deep learning
- Image captioning
- Medical imaging
- Object recognition
- Parameter estimation
- Robust fitting
- Segmentation
- Video surveillance
- Augmented reality
- 3D modelling
- Tracking
- Visual question answering.

AIML's strategies

Recruit and retain high calibre people

AIML has built a reputation as a highperforming research group because we have talented staff and students. Our standards for recruitment are very high, and we are able to promote a fantastic work environment. This continues to strengthen the international reputation of the group.

High quality research

AIML is ranked in the top four in the world on many metrics because of our commitment to high quality research, and research translation. Visibly achieving high-quality research in an extremely competitive field is critical to our ability to attract the top staff, students, and commercial partners.

Research impact

AIML's history of high-impact pure and applied research is critical to our credibility, and thus to our continued success. Our reputation has been developed through decades of world-class research, and collaboration across a variety of fields.

AIML's key actions

- Collaborate with world-leading researchers and companies to develop high-impact products and solutions
- Identify and exploit new opportunities for high-impact research and research translation
- Raise the profile of South Australia and the University of Adelaide as a focus for high quality research
- Identify and attract high-quality staff and students to grow AIML's research capacity.



AIML THEMES

MACHINE LEARNING THEORY

Advancing the mathematical fundamentals of the field.

ROBOTIC VISION

Enabling machines that see.

VISION AND LANGUAGE METHODS

Enabling natural language interactions with systems that exploit visual information.

TRUSTED AUTONOMOUS SYSTEMS

Developing machines that cooperate actively with humans.

MEDICAL MACHINE LEARNING

Applying machine learning methods to problems in Health and Medicine.

ADVANCED REASONING AND LEARNING

Enabling higher-level analysis and ongoing learning in machine learning methods.

AIML CHAIR & DIRECTOR REPORTS



PROFESSOR ANTON MIDDELBERG REPORT OF THE DEPUTY VICE- CHANCELLOR (RESEARCH) AND ADVISORY BOARD CHAIR

The 21st Century is a time of considerable change. Artificial intelligence is beginning to have a major impact on our lives and has huge growth potential.

The Australian Institute for Machine Learning (AIML) leads the way as Australia's first university-based research body dedicated to machine learning and is the largest machine learning group in Australia.

A joint initiative of the South Australian Government and the University of Adelaide, AIML launched early in 2018. Built on the success of the Australian Centre for Visual Technologies, AIML has taken high-impact applied research to another level, becoming a world-leader in applying machine learning methodologies to diverse priority areas including space, agriculture and medical health.

AIML has grown from strength to strength in 2019. Highlights include moving into our new state of the art premises at Lot14; securing contracts with diverse industry partners including Lockheed Martin, the Australian Institute of Sport and Wine Australia as well as supporting AIML students graduate with postgraduate degrees.

AIML aligns with the University of Adelaide's *Strategic Plan, Future Making*, which is designed to help realise our purpose as a catalyst of knowledge creation and innovation, an engine of social advancement and an active participant in the local, national and global economies.

AIML is also strongly engaged with the University of Adelaide's five pillars of the Strategic Plan:

1. Connected to the Global World of Ideas: We are partnering with companies thinking strategically about artificial intelligence.
2. A Magnet for Talent: AIML hosts top-performing researchers from all over the world, helping to extend our global reach.
3. Research that Shapes the Future: Artificial intelligence is a key to the future, and we want Adelaide to be on the front foot. An institute dedicated to advancing machine learning ticks this box.
4. A 21st Century Education for Growing Community of Learners: AIML is providing our bright young minds with opportunities to stay in South Australia to study and pursue a career in emerging technologies.
5. The Beating Heart of Adelaide: AIML has already become a catalyst to bring companies and people into South Australia and to generate significant economic activity.

I hope you enjoy learning about the many AIML highlights from this 2019 annual report.

PROFESSOR ANTON VAN DEN HENGEL DIRECTOR'S REPORT

AIML's world-class, interdisciplinary research provides South Australia and the nation with significant social, economic, educational and environment benefits.

We are Australia's largest, and one of the world's best research groups in artificial intelligence, computer vision and machine learning.

AIML was built on the core of a strong existing research group, the Australian Centre for Visual Technologies (ACVT). The ACVT started with 5 people in 2007, and had grown to over 120 members in 2019.

The research capability and reputation of AIML continues to grow.

Proud moments have included: 18 papers accepted to CVPR19; winning global awards such as 1st in visual question answering Challenge 2.0; and celebrating ARC DECRA, Future Fellowship and Discovery successes with the team.

Thanks to the ongoing transformative funding from the South Australian State Government, 2019 has seen AIML: assist SA SMEs to integrate and adopt machine learning within their businesses; develop an executive education course to introduce executives to machine learning; and build new partnerships across SA innovation neighborhoods including Adelaide BioMed City, Waite, Roseworthy and the Loxton Research Site.

As part of our role as a national leader in the field, AIML has partnership with the MIT SA living Laboratory, hosted a 2019 summit of key research leaders in machine learning, and participated in a national summit on AI in Canberra to discuss implementation of the national AI roadmap.

The above inevitably represents a small fraction of the work carried out by an amazing team. It has been a privilege to be a part of it.

ADVISORY BOARD MEMBERS



Professor Mike Brooks

Provost, University of Adelaide (Board Chair until October 2019)

After announcing that the Australian Institute for Machine Learning was to be established,

we were inundated with enquiries from companies, government and research institutions about how to partner with us. Australia needed an institute for machine learning, and we gave it to them.



Professor Anton Middelberg

Deputy Vice-Chancellor (Research) (Board Chair from October 2019)

AIML has grown its productive links with industry and governments throughout 2019, while also building outreach to schools and the next generation of AI researchers. We expect 2020 will see projects into new fields including health and agriculture.



Professor Anton van den Hengel

Director AIML

We have seen incredible growth in our capability, research income, and visibility. It's particularly

gratifying to see that so many of the existing and new staff have driven these results.



Dr Tony Lindsay

Director, STELaRLab, Lockheed Martin Australia (Science, Technology, Engineering Leadership and Research Laboratory)

It's wonderful for a new institute to secure

a major contract. AIML's three-year strategic partnership agreement with Lockheed Martin, with significant cash and in-kind investment from LM, is just that. We'll work together to advance machine learning techniques in intentional machines.



Ms Lusie Guthrie

Independent Business Consultant; Chair, BioMelbourne Network; Chair, Medicines Manufacturing Innovation Centre

One of the keys to AIML's success is

going to be in how well it brings innovative ideas and products to global markets. The Board will assist researchers wherever possible, from forming strategic partnerships with important companies and governments, to concept and product development.



Mr Adam Reid

Chief Executive, Department for Innovation and Skills

AIML was established with the help of a \$7.1 million funding agreement with the State Government.

AIML's focus on skills development, defence industry engagement, government efficiency, and SME and global R&D will drive improvements in productivity that underpin sustainable economic growth in South Australia.

Developing talent in rapidly advancing technology domains, including machine learning, is critical to ensure that South Australia is a destination for technology based businesses that can solve globally relevant problems and build successful businesses in South Australia.

AIML's collaborative research partnerships with defence companies will address the priority needs of the defence industry and contribute to Australia's necessary industrial capabilities. This will continue to build on South Australia's long history of success in defence research, underpinned by strong education and industry partnerships.

AIML delivers an innovative model for effective research collaboration between the University, industry, start-ups and government.

RESEARCH THEMES

The core of machine learning is the development of systems that are able to learn by example. This is important for a range of tasks, but particularly for those that humans have difficulty in specifying algorithmically.

Our focus at AIML is to develop fundamental new methods and technologies in machine learning. Our research can be broken down into 6 major themes.

RESEARCH PROGRAM & THEME LEADERS



Machine Learning Theory

Advancing the mathematical fundamentals of the field.

Professor Chunhua Shen



Trusted Autonomous Systems

Developing machines that cooperate actively with humans.

Professor Anton van den Hengel



Robotic Vision

Enabling machines that see.

Professor Ian Reid



Medical Machine Learning

Applying machine learning methods to problems in Health and Medicine.

Professor Gustavo Carneiro



Vision and Language Methods

Enabling natural language interactions with systems that exploit visual information.

Dr Qi Wu



Advanced Reasoning and Learning

Enabling higher-level analysis and ongoing learning in machine learning methods.

Professor Javen Shi

MACHINE LEARNING THEORY

Advancing the mathematical fundamentals of the field

Machine learning continues to be a fascinating field of research. At its most basic, it is the science of getting computers to act and learn over time without being explicitly programmed, but its areas of research and application are exploding.

What can machines learn?

After teaching computers what to do with examples of data and information, machines can learn to:

- detect disease and other medical problems
- operate machinery and drive cars
- recognize faces and groups of people
- predict retail buying trends and socioeconomic patterns.

And much more!

Research strengths at AIML

A particular strength of researchers at AIML is our ability to teach computers using only weakly labelled data. Our researchers are making major contributions in four key aspects of machine learning theory:

- **Deep learning**, by advancing the mathematical tools that underpin the training of computers to perform humanlike tasks
- **Systems optimisation**, by developing the theory, algorithms and tools that can predict environmental factors such as electricity prices and the weather, which are constantly changing
- **Robust statistics**, by developing procedures to analyse data to make sure that information from machines remains informative and efficient
- **Probabilistic graphic models**, by improving the way that machines model complex relationships among variables, to improve the reliability of the inferences they make.



Theme leader
Professor Chunhua Shen



TACKLING TRAFFIC CONGESTION IN SPACE

Professor Tat-Jun Chin

Director of Machine Learning for Space Engineering

Thousands of man-made objects orbit the Earth, including satellites, space installations, space debris and junk.

One or two operating satellites are lost in space crashes each year, as more nations and commercial companies develop space programs.

There is an increasing need to monitor space traffic, to try to prevent collisions and damage to trillions of dollars worth of technological investments.

Dr Tat-Jun Chin leads a multidisciplinary research team, working in collaboration with industry to develop a space-based surveillance system.

They aim to deploy satellites that use optical sensors to detect objects in space, increasing the capability and utility of space situational awareness.

The team won a global challenge hosted by the European Space Agency.

They used a unique combination of machine learning and 3D vision algorithms to determine the most accurate orientation of an object in space, edging out 50

competitors from some of the world's most prestigious universities and space technology companies.

"Figuring out the orientation of an object is a long-term study problem in computer vision and AI," Dr Chin says.

"If you want to program a robotic arm to make coffee, you need to figure the orientation of the object with respect to the robot; we are now applying those techniques in space."

Our team's research forms an important component of the growing local space industry.

It could be the foundation for new technologies to remove space debris, or to refurbish and prolong the life of ageing space assets and prevent them adding to space pollution.

It could even facilitate development of space depots; jumping off points for distant space travel.

All these exciting possibilities begin with space traffic management.



Theme leader
Professor Ian Reid



ROBOTIC VISION

Enabling machines that can see.

When machines have the ability to see, their capabilities grow substantially. Using one or more video cameras, they are able to collect visual data to understand the physical world.

Why pursue vision for machines?

As humans, we rely heavily on our vision to perform all sorts of tasks, including to see where we're going, who is in a room, and the emotions of faces. If we could enable machines to see as well as – or better than – we do, this would open up amazing possibilities.

Research strengths at AIML

Here are three key areas of robotic vision we focus on:

- **Visual simultaneous localisation and mapping (SLAM).** This technology uses a 3D vision camera to determine the position and orientation of the machine, while mapping the unknown surrounding environment. It enables field robots, drones and autonomous vehicles to navigate independently. The technology is not reliant on satellite information, but is able to accurately measure the physical world.
- **Semantic vision.** It's one thing to collect vision data, but how can we be sure that machines can make sense of it? Semantic vision is the field of processing the often huge amount of data in a way that produces meaningful, understandable information.
- **Vision and language**

Australian Centre for Robotic Vision

AIML is a founding partner of the ACRV, which carries out breakthrough science and technology under four research objectives: robust vision, vision and action, semantic vision, and algorithms and architecture.

OBJECTIVELY MAPPING THE FUTURE

Kejie Li PhD student with Prof Ian Reid

We tend to take for granted how we navigate the three dimensional world we inhabit, because our brains rapidly process messages sent by our senses and just as quickly tell our bodies what to do in response.

Equipping robots with similar navigational skills has been a research challenge for some time. It starts with a camera transmitting visual images to enable Simultaneous Localisation and Mapping (SLAM).

Building robots with consistently reliable SLAM skills would be a great leap forward in robotic vision.

PhD student Kejie Li has been working towards this leap through object-oriented SLAM, which enables robots to recognise objects in context.

Traditional SLAM can only reconstruct an environment using low-level geometry based representations, such as data points on a 3D grid (3D point cloud).

Kejie says that although such representations can indicate where items might be occupied in the 3D space, they fail to provide the descriptive information used by people to

recognise and utilise a specific object. For example: this is a chair, I could sit in it, walk around it, perhaps move it. This description helps create a more accurate map.

“Unlike traditional SLAM systems, the mapping of our object-level SLAM is based on objects with semantic meaning,” Kejie says.

“In particular, in order to reconstruct 3D object shapes from partial observations, we train a deep neural network to ‘hallucinate’ the full 3D shape of an object given only a few images, or even just one image.”

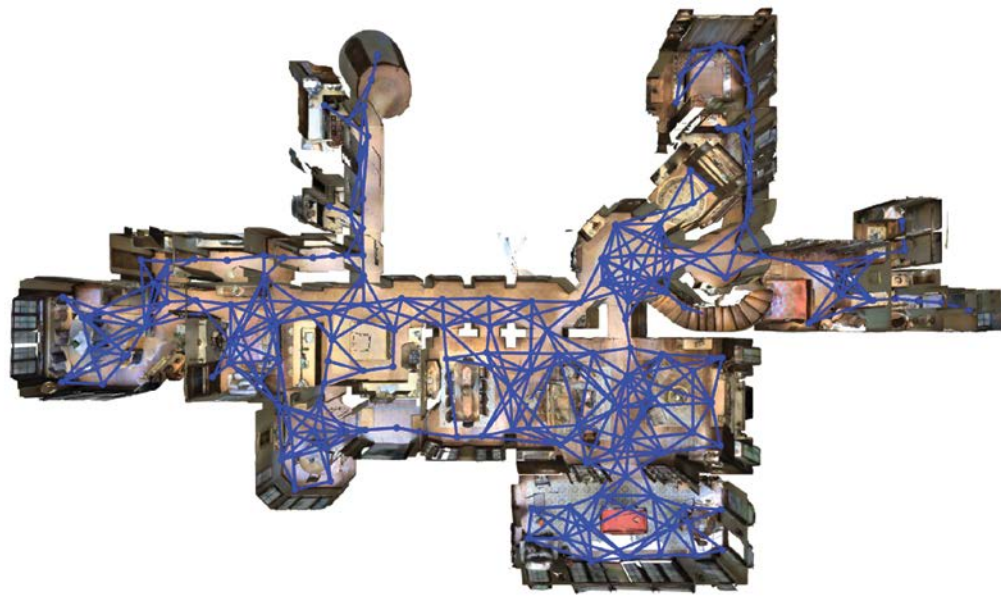
Placing the reconstructed objects in the 3D space would enable a robot to ‘see’ what and where the objects are.

Kejie says we are likely to see many virtual reality devices entering our daily lives and that representing the environment via object-level mapping would help them to understand and navigate their surroundings in the same way that people do.

The research has a long way to go, but his team is helping to map the way forward.

CASE STUDY
ROBOTIC
VISION

FUNDING: ARC CENTRE OF EXCELLENCE FOR ROBOTIC VISION



Theme leader
Dr Qi Wu

VISION AND LANGUAGE METHODS

Enabling natural language interactions with systems that exploit visual information

Recognising cats and dogs is now an easy task for a computer. The next frontier? Computers that understand natural (human) language and vision (images) in order to answer questions.

Teaching with data

Machine learning starts with making each system learn from data; we do not hard code. A big challenge can be having access to enough data. Fortunately, AIML has huge data sets from partners, in which we have the question, the image and the correct answer. These are standardised data sets. Each VQA system can be individualised to suit a particular task, from assisting with medical treatment plans, to assisting people who are vision impaired.

Research strengths at AIML

Our two major areas of focus are:

- Dialogue. How can we make VQA useful in real life? When people converse with

each other, they don't ask just one short question; there is to-ing and fro-ing and ongoing interaction. A useful VQA system will need to keep track of what is being asked, know how to follow up, and maybe ask questions back to the person to clarify. To date, systems are only good at this when they have been heavily trained.

- Data retrieval. How can we enable VQA systems to retrieve information as it is needed? Let's say the system receives a question about zebras, but it doesn't know what a zebra is. We want it to be able to find out by itself.

BRING ME A CUSHION

Dr Qi Wu Director of Vision and Language Methods

A reverie is a state of being pleasantly lost in one's thoughts, a daydream.

Having a home robot that can see, talk and actually help around the house may seem the stuff of daydreams, but Dr Qi Wu leads a project to make such dreams a reality.

Remote Embodied Visual Expression in Real Indoor Environments (REVERIE) aims to advance real-world vision and language research.

The challenge is to get a robot to complete a task by following precise instructions, including directions, descriptions and locations.

"You can ask a 10-year-old child to bring you a cushion, and there is a good chance that they will succeed, even in an unfamiliar environment," Qi says.

"While the probability that a robot will achieve the same task is significantly lower.

"Children have a wealth of knowledge learned from similar environments that they can easily apply, including that cushions may be found on couches, that couches inhabit lounge rooms,

and that lounge rooms are often accessed through hallways."

Children are also able to interpret natural language instructions and associate them with the visual world.

Qi's research addresses robots' lack of these capabilities, to stretch the limits of their domain of application.

His team plans to equip robots with real-world visual navigation skills and natural language understanding, to be able to follow concise and practical instructions.

Their Matterport 3D simulator uses a 3D image of a real house to extend and test the range of tasks a robot may perform in a real indoor environment.

To be able to ask a robot to bring a cushion, or dust a light fitting, or clean up a room would not be child's play, but indeed a dream come true.

CASE STUDY VISION AND LANGUAGE

Starting Viewpoint



Midway



Target Object



Instruction: Bring me the bottom picture that is next to the top of stairs on level one.

BUILDING TRUST THROUGH Q&A

Dr Damien Teney Postdoctoral Fellow

TRUSTED AUTONOMOUS SYSTEMS

Machines that work cooperatively with humans.

Trusted autonomous systems are reliable and independent. They do not need to be operated by humans, but they work alongside humans, and may communicate, cooperate and negotiate with us or other autonomous systems to achieve goals.

The road to independence

In the beginning, machines were under full human control. Then we created supervised systems (for example, automated sewing machines), and then automatic systems (such as car assembly robots). Autonomous systems are the final step. They can operate without any human intervention at all.

How can they be trusted?

The ‘trusted’ part is the most challenging. Trusted autonomous systems are often being applied in situations where there are big consequences for failing, such as driverless cars and robotic defence technologies. So we need to make sure they are fully reliable with very low probability for error.

Research strengths at AIML

Three key areas we focus on at AIML are:

- developing autonomous systems that are aware of the uncertain environment and can perform complex tasks successfully
- theoretical and practical research to develop systems capable of making transparent and explainable decisions, asking questions when uncertain about decisions or the surrounding environment, and understanding their interactions with the world and applying reasoning to their surrounds
- progress towards intelligently controlled autonomous vehicles.



Theme leader
Professor Anton van den Hengel



Uncertainty is the driver of research. To find out what we don't know, to build our reservoirs of knowledge and to learn who, where, what, when, why and, most importantly, how – we ask questions.

Autonomous systems are becoming an everyday part of more and more diverse industries. It is important that the people working with them find them trustworthy and reliable, so as to have confidence in the outcomes.

Senior Researcher Damien Teney has been working with Dr Qi Wu and Dr Ehsan Ebbasnejad on developing trusted autonomous systems that function reliably in a complex environment and work collaboratively with people to solve problems.

To do this the autonomous systems need to be aware of uncertainty, ask questions to resolve that uncertainty and provide clear and explainable decisions in response.

This would mean they understand their interaction with the world and are capable of applying reason to a situation.

The primary technology developed in this field has been in what is called visual dialogue, which enables an ongoing conversation about an image or other visual information.

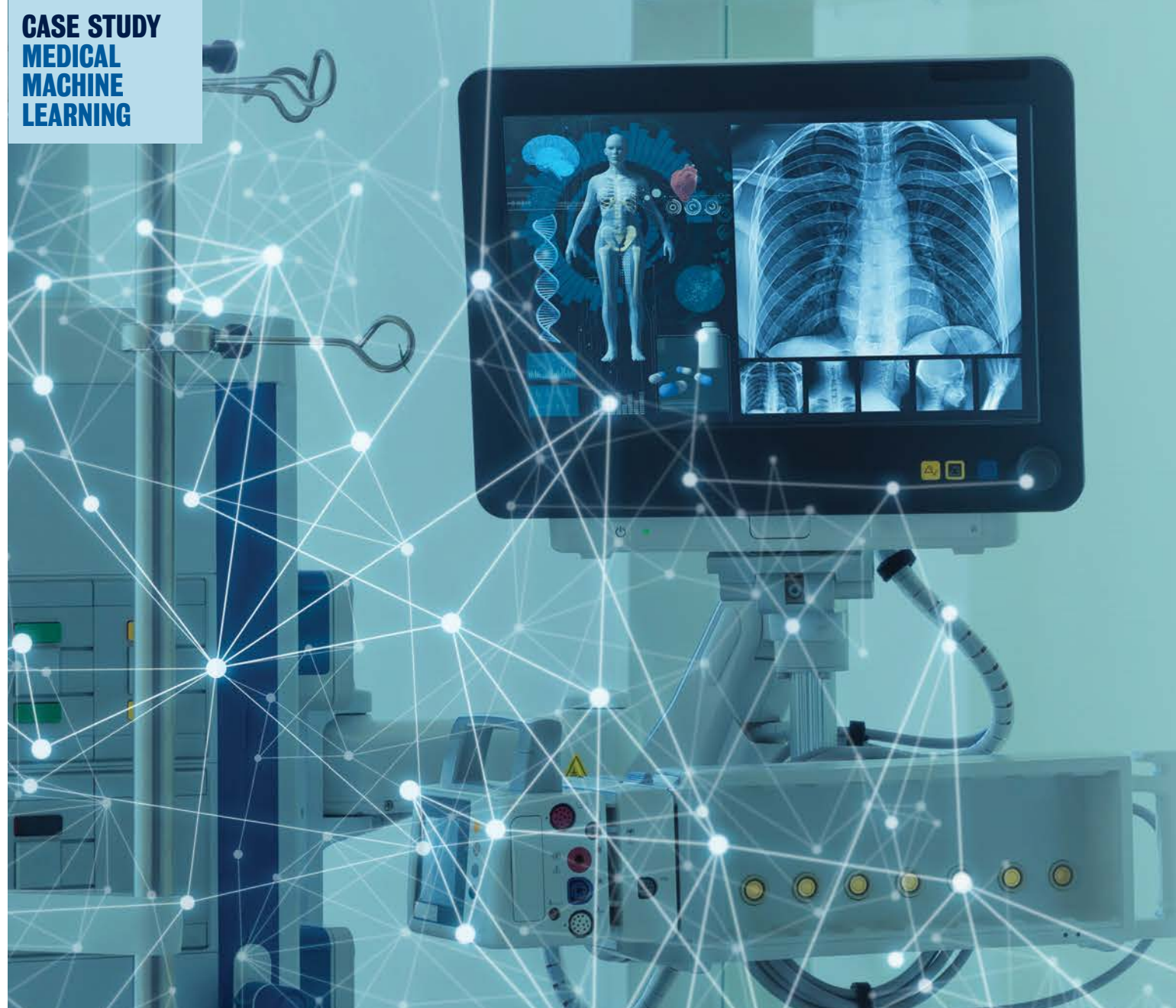
Damien says his team's research enables questions to be asked proactively, so it's not always left to people to drive a conversation and the autonomous system to just respond.

“This can fill in the ‘unknown unknowns’ by supplying questions we may not have realised needed asking and therefore help to find answers we didn't necessarily know we were looking for.”

These conversations aim for a specific outcome, cutting out pointless chat and speeding up a result.

It is a significant step towards achieving the goal of real active collaboration between people and the autonomous systems they work with.





BUILDING CONFIDENCE IN CANCER DIAGNOSIS

Professor Gustavo Carneiro, Director of Medical Machine Learning

Early diagnosis is the first step in successful cancer treatment and medical imaging has become intrinsic to the diagnostic process.

Professor Gustavo Carneiro's research team has been using AI to boost diagnostic screening for potentially deadly bowel and rectal cancer.

Polyps are abnormal growths that look like small bumps in the colon; some are benign but others may grow into cancer and need to be biopsied or removed.

Some are already cancerous and will need surgery, chemotherapy or radiotherapy to stop the spread.

It's very difficult to determine during an examination which kind are present and only a few experts are able to do that.

Gustavo's research team used more than 1000 images of polyps found during colonoscopies to teach an AI program to identify differences and report level of certainty around the identification process.

Identifying and treating bowel cancer is quicker and more effective when doctors can diagnose it during a colonoscopy, rather than having to wait for further tests.

Real-time diagnosis assists the endoscopist to make decisions: leave it alone, biopsy or remove.

This will fast track treatment, decrease patient risk and reduce costs thanks to faster treatment and a reduction in colonoscopy related complications.

"Our target is that this system will be as accurate as an experienced endoscopist in the detection and classification of polyps," Gustavo says.

The research has been very positive, offering the hope of moving the computer-assisted diagnostic system to clinical trials in the next few years.

Translating research findings into use by medical experts will be a big step forward for machine learning in health.

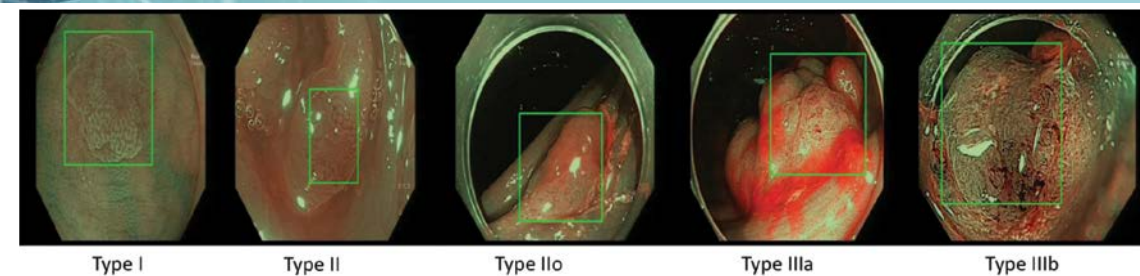


*Theme leader
Professor Gustavo Carneiro*

MEDICAL MACHINE LEARNING

Applying machine learning methods to problems in Health and Medicine.

With more data available in the healthcare sector than ever, the AIML is seizing the opportunity to make significant progress in clinical diagnosis and prognosis through data analysis. Using machine learning techniques, computers can analyse large datasets, potentially including billions or trillions of data points, and learn to detect illness sooner and with higher success rates leading to a healthier society.



Improving patient understanding

One key area of research has been improving clinical decision making and patient understanding. Typically, if a patient has follow-up questions after a diagnosis, they are either required to make another appointment, causing delays and increased costs, or resort to search engines and get general and potentially inaccurate advice. Using Artificial Intelligence, patient oriented interfaces can be developed to provide meaningful and bespoke information to improve patient wellbeing.

Research strengths at AIML

AIML has partnered with world leading medical research institutions and together are we working on solving issues that have real impact on healthcare.

We are currently focusing on the following areas:

- applying machine learning to cardiology, cancer (colorectal and breast cancer), obstetrics and gynaecology, orthopaedics (arthroscopy, hip replacement), neurology (transient ischaemic attack, stroke, vascular dementia), and public health
- improving clinician certainty through machine learning methods to provide a 'second opinion'
- increasing patient awareness and experience through improving accessibility to approachable and bespoke information.

GOING DEEP FOR MINERAL TREASURE

Professor Javen Shi Director of Advanced Reasoning and Learning

Prominent Hill, in South Australia's far north, has been a rich source of minerals for almost 20 years. Keen to extend the life of this resource, mine operator OZ Minerals created a crowd-sourcing competition to pinpoint potential exploration sites.

The OZ Minerals Explorer Challenge took place over three months, involving more than 1000 participants from 62 countries.

They dug through more than six terabytes of public and private exploration data to identify mineral deposits and find new ways to access them.

There was a \$1 million prize pool on offer as well as the prestige of leading the way for the local mining industry.

Professor Javen Shi led a team from AIML and the University's Institute of Mineral and Energy Resources on the treasure hunt, in collaboration with industry experts in minerals exploration and geoscientific modelling.

His DeepSightX consortium exploited multi-disciplinary skills at the intersection of artificial intelligence and geoscience to analyse the exploration data sets.

AIML provided machine learning techniques and engineering support, while the Geoscience team members contributed an understanding of the exploration process, industry best practice and true domain expertise.

"The team developed a drilling exploration plan that took advantage of the overwhelming data available, while being justifiable from a geoscientific perspective," Javen says.

"We achieved this by integrating the latest concepts from mineral systems modelling, with recent breakthroughs in deep learning – artificial neural networks and algorithms inspired by the human brain that learn from large amounts of data – and computer vision."

The result was a world-class predictive modelling capability, which confidently recommended a series of drilling targets and enabled feedback of more data to further develop the model and AI targeting.

The DeepSightX team took out second place in the OZ Minerals Explorer Challenge, winning a \$200,000 prize.

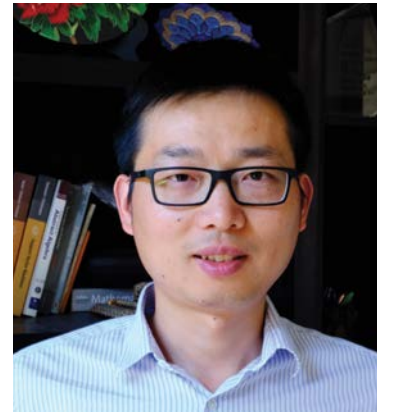
The results of the international challenge offer the potential to revitalise mineral exploration and discovery in South Australia.

Javen's team was proud to further the cause of integrating AI into the mining industry and plans to expand and commercialise its work.

"The competition was a prelude for DeepSightX and we look forward to the exciting journey ahead," Javen says.

The DeepSightX team has embraced the opportunity to develop deep learning to improve mineral exploration and help uncover the treasure in our own backyard.

CASE STUDY ADVANCED REASONING AND LEARNING



Theme leader
Professor Javen Shi

ADVANCED REASONING AND LEARNING

Enabling higher-level analysis and ongoing learning in machine learning methods

Recognising patterns in complex datasets is at the heart of machine learning. With the efficiency improvements made possible by innovation in this field, algorithms that can interpret and learn from data from any industry are key.

AI that makes sense

With artificially intelligent systems being used to inform decisions in the public and private sectors, it is crucial that the solution provided can be understood and justified by humans. Researchers at the AIML are designing AIs that make decisions using logic and reason, not simply magic.

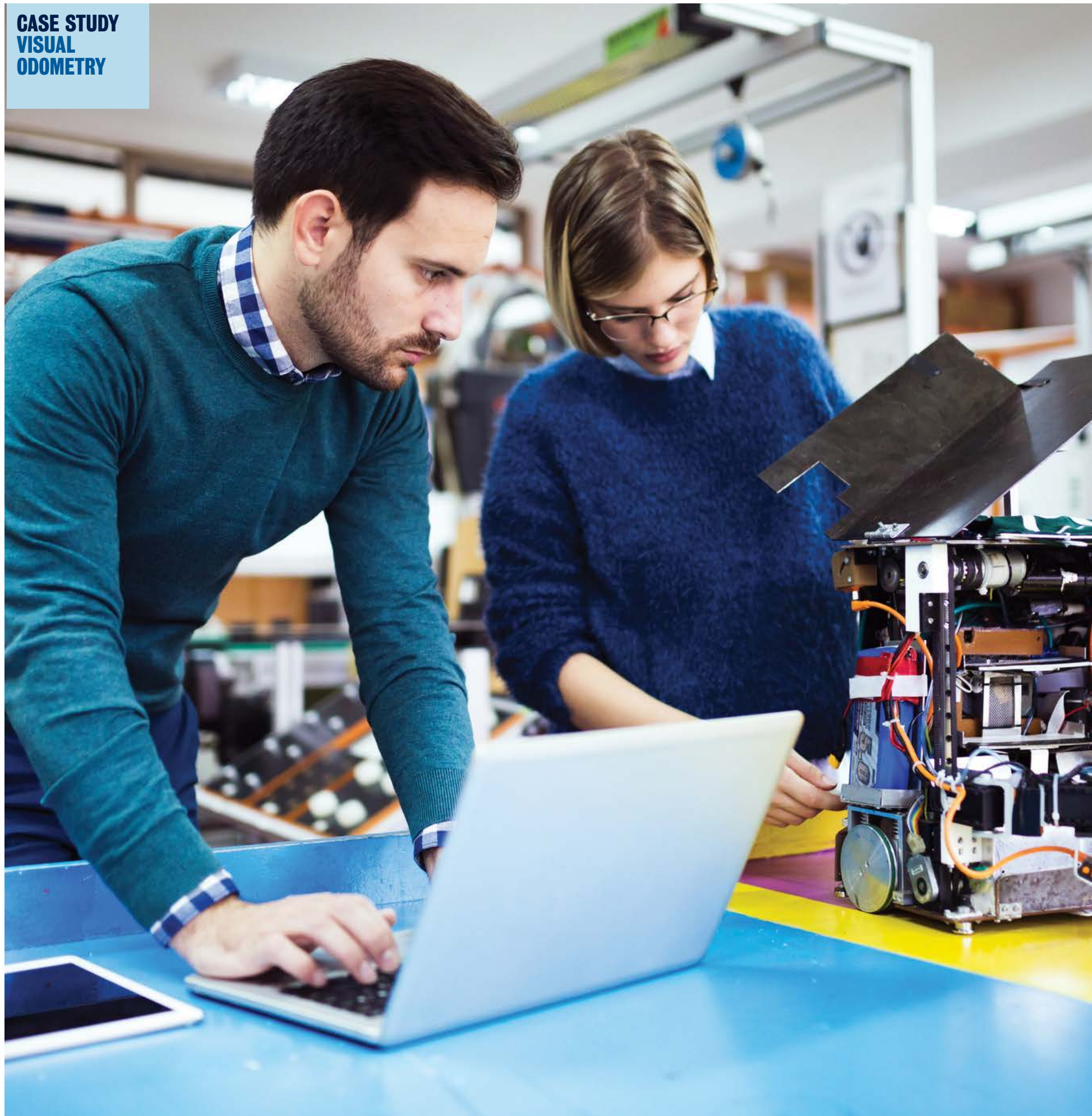
Industry independence

Machine learning has the potential to deliver substantial improvements in nearly every industry. With research into advanced learning, models are capable of drawing conclusions from complex relationships between variables based on potentially trillions of data points. Needless to say, this level of analysis has previously been inaccessible by humans.

Research strengths at AIML

Two key areas we are focusing on are:

- advancing machine learning through research into core theory in optimisation and deep learning and developing algorithms that allow for analysis beyond today's capability,
- developing systems that unlock the real-world potential of AI and can be applied directly to industry challenges.



WORKING ALL THE ANGLES FOR BETTER VISION

Huangying Zhan, PhD student with Professor Ian Reid

Visual odometry analyses camera images to determine the position and orientation of a robot, so it can localise itself.

An on board sensor, often a single camera, tracks visual landmarks for navigation, in the same way that people rely heavily on their vision to get around.

With rapid advancement in mobile robotics and industrial automation it has become an increasingly important area of research – resulting in innovative and helpful tools from robo-vacuum cleaners to the Mars Rover.

Working with Professor Ian Reid, Huangying has been advancing visual odometry by integrating traditional geometric methods and newer deep learning methods of measurement and analysis.

They are trying to overcome a longstanding problem in computer vision when using a single camera, called Monocular Visual Odometry.

“We try to revisit the basics of visual odometry, using geometry-based methods, and draw the best from a learning approach and a geometric approach to solve the problem in a simple but effective way,”

Huangying says.

Huangying has built a system called DF-VO that uses a deep optical flow network to establish good correspondences between images.

These are used for geometry-based approaches to estimate the camera motion.

Huangying says the system is state-of-the-art for monocular VO.

“More interestingly he has shown that the deep networks can be fine-tuned online, so this is a step towards an online learning system that can get better and better at a specific task just by ‘watching video’.”

A lot of computer vision tasks rely heavily on pure deep learning, but Huangying says it’s important not to abandon traditional methods that still have a lot to contribute to building simple yet effective and robust systems.

The ultimate aim is to create lifelong learning systems that enable robots to continually improve how they operate in the world.

 **FUNDING: ARC AUSTRALIAN CENTRE OF EXCELLENCE FOR ROBOTIC VISION**

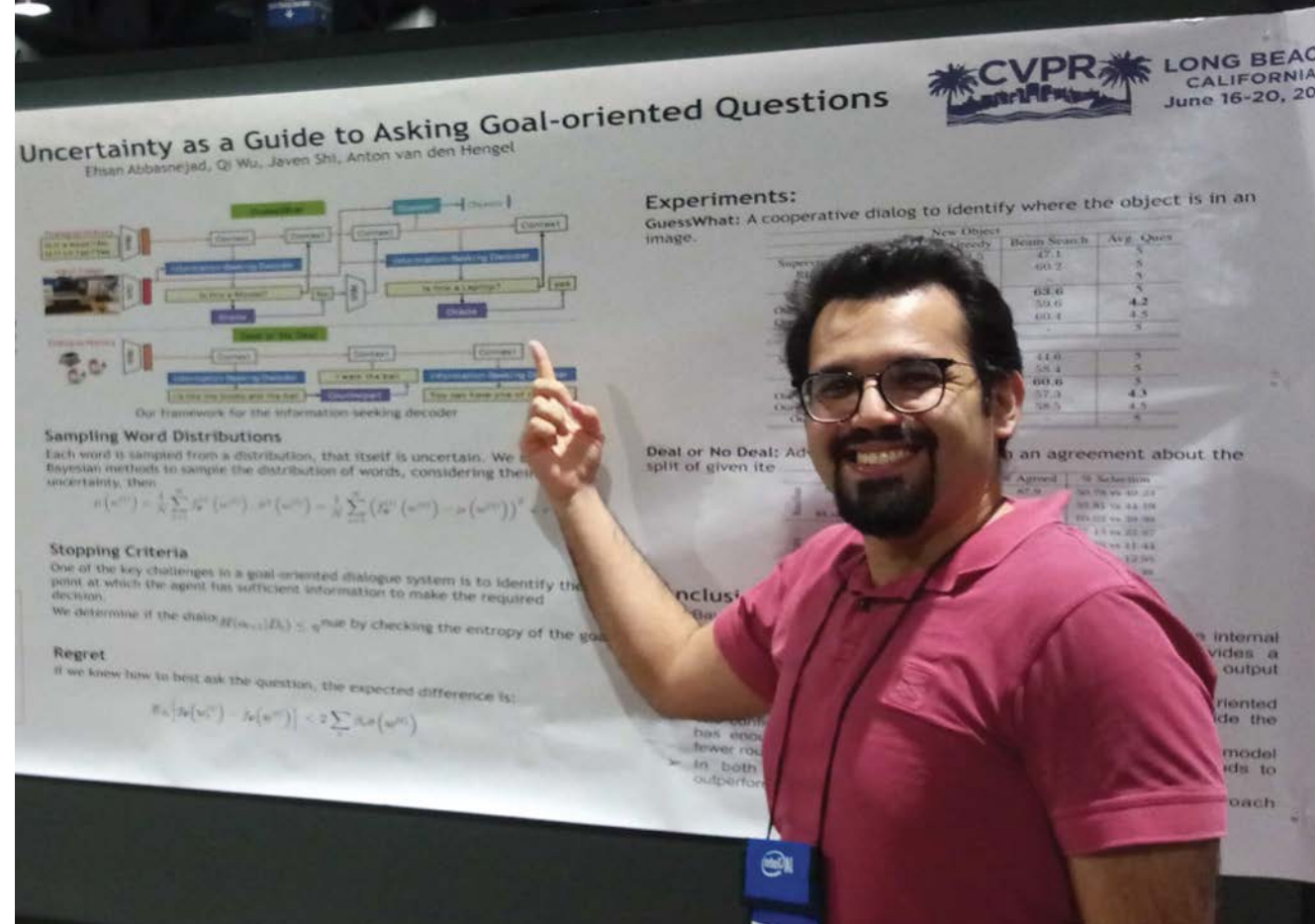
AIML @ LOT FOURTEEN

In December 2019, AIML officially moved its operations over to Lot 14 to take residence in the former Women's Health Centre building.

With the heritage listed building being over 80 years old, the 2,400 square metre premises was modernised to facilitate cutting-edge, state-of-the-art research.



CONFERENCE HIGHLIGHTS



SA Regional Development Conference

Innovation Along the Value Chain was the theme of this conference held in Tailem Bend in May. PhD Graduate Mehdi Hosseinzadeh spoke on the fundamental problem of “The Future of Artificial Intelligence in the Food Industry”.

ICRA 2019

The International Conference on Robotics and Automation was held in Montreal in May. PhD Graduate Mehdi Hosseinzadeh spoke on the fundamental problem of Simultaneous Localization and Mapping and presented a way to improve map quality without requiring additional hardware in mobile robotics at the 2nd International Workshop on Lines, Planes and Manhattan Models for 3-D Mapping.

CVPR2019

The conference on Computer Vision and Pattern Recognition was held in June in Long Beach, California. AIML representatives who presented papers included Dr Hui Li, Dr Ehsan Abbasnejad and Dr Damien Teney. The AIML had 18 publications accepted in total.

KDD 2019

Anchorage in Alaska hosted the KDD conference on Knowledge Discovery and Data Mining in August. Guansong Pang, Professor Anton van den Hengel and Professor Chunhua Shen’s paper on Deep Anomaly Detection with Deviation Networks was accepted for oral presentation.

BMVC 2019

AIML was well represented at the 30th British Machine Vision Conference, held in Cardiff in September. Papers from Professor Ian Reid and PhD students Jiawang Bian, Kejie Li, Ravi Garg and Ming Cai were accepted.

AI for Business Summit

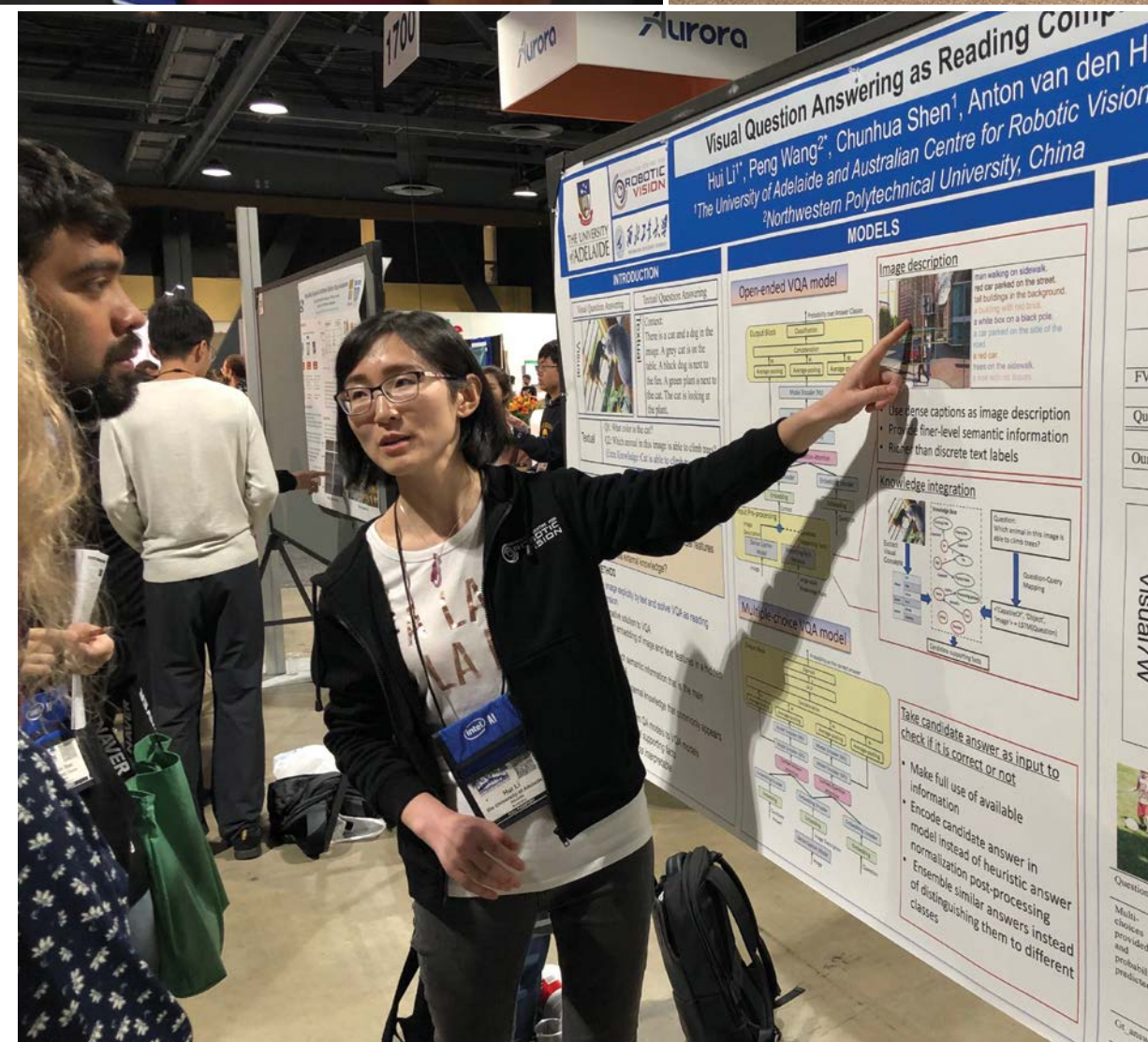
AIML was strongly represented in Sydney in September, with Professor Ian Reid presenting on how Computer Vision, Robotics and AI interrelate and what the future looks like for robotics; and Dr Paul Dalby providing insight on the uptake of AI in business and government on an interdisciplinary panel.

IMARC 2019

The International Mining and Resources Conference was held in Melbourne in October. Dr Zygmunt Szapka delivered the METS Technology workshop on data analytics and machine learning, and how to prepare businesses for to take advantage of the new technologies.

NeuroEng 2019

Professor Mark Jenkinson presented on Big Data MRI at the 12th Australasian Workshop on Computational Neuroscience and Neural Engineering in Adelaide in November.



AIML IN THE COMMUNITY – CAPACITY BUILDING

Austmine 2019

In May Dr Zygmunt Szpak ran “Machine learning: what does that actually mean for a METS business?”, a workshop teaching industry professionals from the Mining Equipment, Technology and Services (METS) sector about the benefits of machine learning and AI at the Austmine conference in.

Bringing AI to the state libraries

A new partnership between AIML and the City of Adelaide delivered a series of Tech Talks on the present and future possibilities of AI.

Academics from AIML and the broader University spoke to diverse audiences on topics ranging from AI's impact in fashion, health and agriculture, the positive implications of AI on the future job markets; and improvements for diversity in both the AI workforce and data sets.

Strong Women in Future Technologies (SWIFT)

Designed and hosted by AIML, the inaugural SWIFT program engaged students between the ages of 8 to 13 years old who identify as female or non-binary. On Friday the 20th of September, two SWIFT Student Workshops were hosted: for competition winners and a parent/caregiver; and a teacher/educator focus group. It was pleasing to see representation across both regional and metropolitan South Australia.

The aim of SWIFT was to uncover the current understanding of artificial intelligence and machine learning study and career pathways, and the barriers holding young women and gender-diverse persons back from taking up these options. Topics also included understanding unconscious and implicit bias, the imperative for these students to contribute to current and future technologies, and the personal skills required to be successful.

Future Thinkers

Professor Anton van den Hengel was the keynote speaker in November at the third Future Thinkers event in Adelaide for 2019, "Are Robots Taking



Austmine 2019

Our Jobs?" He joined a panel discussion featuring Dr Michelle Perugini and Adrian Fahey from SAGE Group.

Women in Maths Day

To celebrate International Women in Mathematics Day, AIML partnered with other communities at The University of Adelaide to run the first Women in Maths Day SA Conference on Monday 13th May 2019. This event recognised the value and importance of diversity within the field of AI research.

Machine Learning for Executives

Developed and delivered by AIML researcher Dr Zygmunt Szpak in partnership with Executive Education at the University of Adelaide. This course was designed as an introduction for executives wanting insight into machine learning (ML) with a focus of identifying ways AI and ML could support their businesses.

Smarter Regions CRC

AIML held an introductory workshop for potential partners in the Smarter Regions Cooperative Research Centre in Adelaide in October, with a follow-up event in Port Pirie in November.



Bringing AI to the state libraries



The workshops outlined the opportunities and threats posed by AI to regional Australia and invited organisations to indicate specific projects for co-investment.

ETIG working group

The Artificial Intelligence Emerging Technology Interest Group (ETIG) was launched at the Adelaide Oval on the 6th of June with a presentation by Dr Zygmunt Szpak, introducing the series of eight planned workshops and seminars. Delivered in partnership with the Department of Trade, Tourism and Investment (DTTI), the program had a focus on the application and implementation of AI technologies in business and industry.

With members from over 75 unique companies in attendance, the events pragmatically explored data management, licensing, big data analytics and business strategy. AIML worked with key stakeholders, including but not limited to, IBM, Saab and the Department of Energy and Mining to make the events a success.

An important objective of this series was to spawn collaborative projects between members of the group. Four such projects were formed, ranging from automated production processes for Bickford's Australia, to smart probes for advanced sensing and tomography in partnership with MiniProbes and Meat and Livestock Australia.

Strategic alliances were also cultivated between AIML and AiLab, Adiona, Brainframe and Consillium Technology to enhance consulting and industry expertise.

A highlight of the series was having data specialist, speaker and author, Ellen Broad present “Responsible AI in Practice: Openness & Transparency”. She discussed the ideas of ethical, transparent and accountable AI systems; concepts that are of mounting importance as the technology becomes increasingly commonplace.

This collaboration with industry highlighted the increasing rate of digital innovation in South Australia and further cemented AIML as the foundation for that growth.

AWARDS AND PRIZES

Global Space Challenge winners

The Pose Estimation Challenge asked competitors for accurate estimation of distance and orientation (pose) of a spacecraft from its synthetic and real images, captured using computer graphics and a robotic testbed.

The knowledge developed through this competition can be directly applied to Space Situational Awareness (SSA) problems, which is a priority area for the Australian Space Agency due to the increasing concerns surrounding space debris.

Professor Tat-Jun Chin and Dr Bo Chen won a global space challenge run by the European Space Agency, beating teams from a range of prominent universities.

Digital Culture win at Govhack 2019

Congratulations to Team **Artificially Intelligent** including AIML researchers Yasir Latif, Sam Bahrami, Boris Repasky, Mahdi Kazemi and Thomas Rowntree for first place in the Digital Culture category for their work training two machine learning models using two specific data sets.

The first model applied a concept called neural style transfer to current images and historical photos from the History Trust of South Australia's photographic collection. It allowed the style of one image to be transferred to another image, enabling reproduction of any photographic style regardless of the age of the photo.

The second model used a series of old colonist photographs from the State Library of South Australia collection, allowing the user to identify the colonist photograph that most closely resembled themselves. This was achieved using facial similarity detection, a neural network that they trained to find the most similar face.

The aim of the competition was to increase public engagement with the history of South Australia. The team created a physical demonstration where you could walk in front of a camera and in real-time have your colonial doppelganger created which proved to be very engaging.

First Place at Volkswagen Logistics Innovation Day in Shanghai

This global event showcases the latest technologies in automobile manufacturing. Golden Prize (first place) was awarded to Professor Javen Shi and his team, which includes PhD student Mahdi Kazemi Moghaddam for their work in demonstrating how artificial intelligence can improve vehicle manufacturing.

Javen and Mahdi received their first place for the development of a digital factory. This consisted of a dashboard that could monitor and manage the processes taking place on the factory floor, showing performance metrics of systems and ultimately leading to increases in efficiency and safety.

CORE: Chris Wallace Award for Outstanding Research in computer security and computer architecture

Awarded to Dr Yuval Yarom for his internationally significant recent work on hardware vulnerabilities. This is the most prestigious award in Australia for Computer Science research and given on a yearly basis for a notable breakthrough or a contribution of particular significance to the field.

STEM Initiative

Ali Anderson and AIML won the award for Best Industry STEM Initiative at the Electronics Industry Excellence Awards.

Fellowship Success

AAS JG Russell Award

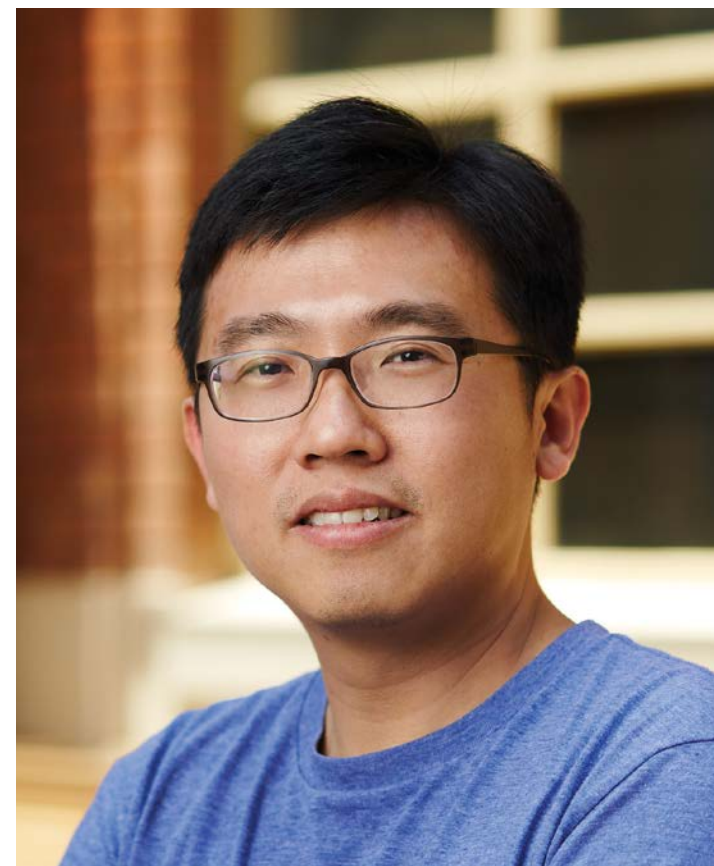
Dr Qi Wu towards his DECRA to develop an Artificial Intelligence agent that communicates with humans on the basis of visual input, and can complete a sequence of actions in environments by combining computer vision, natural language processing and reinforcement learning.

ARC Future Fellowship

Professor Gustavo Carneiro to continue working on the development of computer vision and machine learning techniques in the area of medical image analysis problems. The Future Fellowship is given to outstanding mid-career researchers to enable them to undertake high quality research in areas of national and international benefit, and to conduct this research in Australia.

2nd Prize Winners
(A\$200,000)

**Dong Gong, Javen Qinfeng Shi,
Zifeng Wu, Hao Zhang,
Ehsan Abbasnejad,
Lingqiao Liu, Anton van den Hengel,
Karl Hornlund and
John Alexander Anderson**



ARC DECRA

Dr Yuval Yarom for his project on Microarchitectural attacks and JavaScript: threats and defences. Expected outcomes of this project include novel techniques for protecting web browsers and cloud servers to prevent them from inadvertent leaks of private or sensitive information in an effort to enhance cybersecurity.

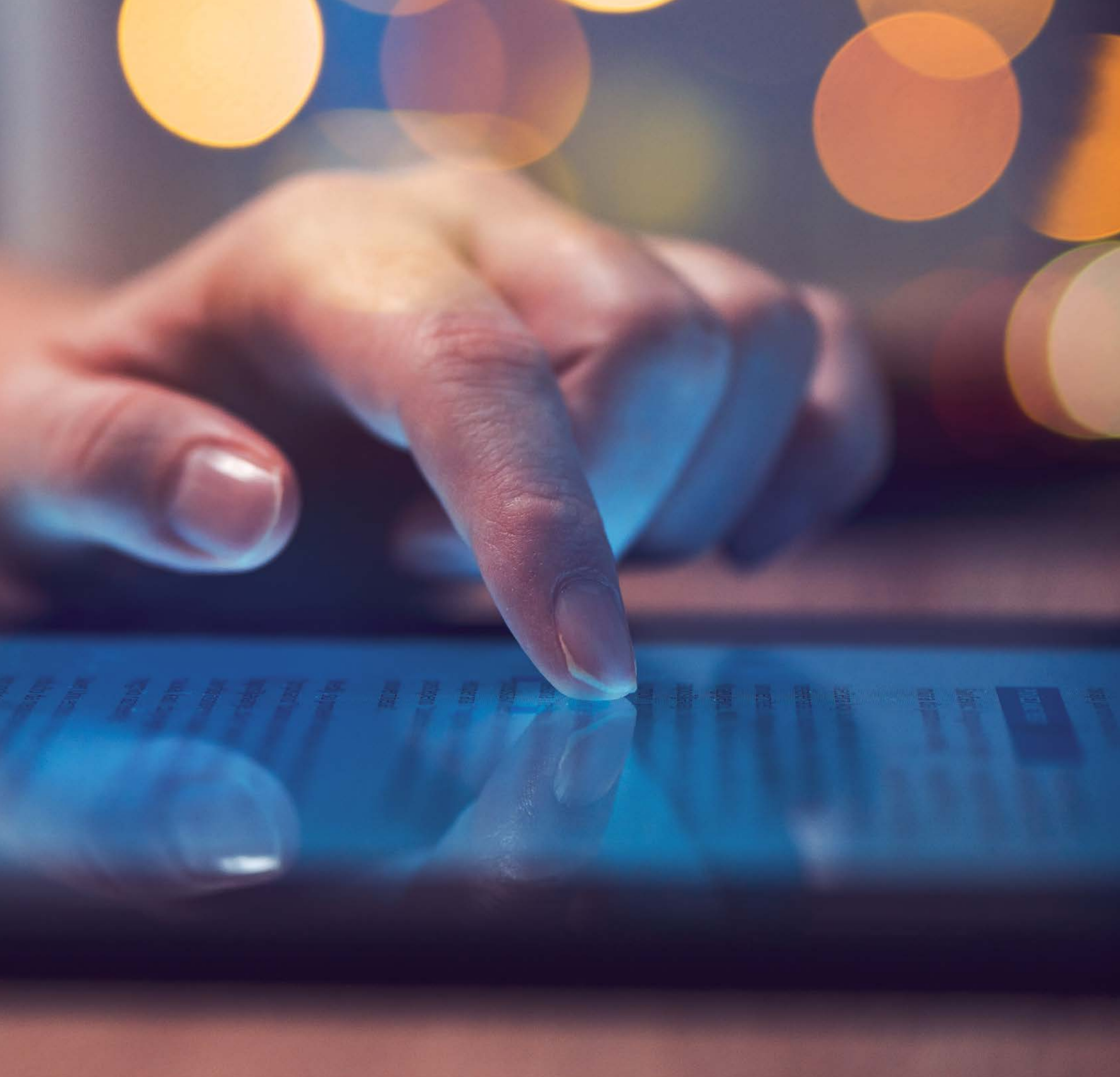
ARC Discovery Grants:

- Professor Tat-Jun Chin
- Professor Chunhua Shen
- Professor Ian Reid
- Dr Seyed Hamid Rezatofighi

Postgraduate Scholarships

Congratulations to:

- **Lockheed Martin Honours Scholarship** to Clint Gamlin for his work in machine learning deployment on Field Programmable Gate Arrays;
- **Lockheed Martin PhD Top-up Scholarship** to Jordan Yeoman who is investigating new machine learning techniques in the area of reinforcement learning
- **Google PhD Fellowship** to Zhi Tian, supervised by Professor Chunhua Shen, was awarded a Google PhD Fellowship in Machine Perception.



FACEBOOK INTERNSHIP KEJIE LI GETS A SLAMMING START IN SEATTLE



PhD student Kejie Li's work on Simultaneous Localisation and Mapping (SLAM) gained him a six-month internship with Facebook Reality Lab in Seattle, starting in September 2019.

There he worked on an object-based mapping system, known as FroDO, with a paper to be published in *Computer Vision and Pattern Recognition 2020*.

Kejie says his time working with industry has taught him about improving research efficiency by focusing on daily deliverables and quickly building on ideas that flow from that focus.

He has also learned to look beyond quantitative evaluation, important as that is, by keeping in mind that the ultimate goal is to make something work in real life.

A highlight of Kejie's Facebook odyssey has been working with 'rock stars' of his field, including Steven Lovegrove and Richard Newcomben and his inspiring mentor Julian Straub.

While breakfast at the Facebook café provides an awesome start to the research day, Kejie says that nothing beats Australian coffee!

AIML STAFF

AIML Director

Professor Anton van den Hengel
Director, Trusted Autonomous Systems
Deep Learning and vision & language problems

AIML Academics

Professor Emma Baker
Housing and Healthy Cities

Professor Gustavo Carneiro
Director, Medical Machine Learning
Medical image analysis

Professor Tat-Jun Chin
Director, Machine Learning for Space
3D mapping, augmented reality and autonomous robots

Associate Professor Anthony Dick
Deputy Director
Visual tracking analysis

Professor Mark Jenkinson
Professor of Neuroimaging
Medical image analysis

Professor Chris Leishman
Economics of housing markets

Dr Lingqiao Liu
ARC DECRA Fellow
Machine learning and natural language processing

Professor Andrew Lowe
Plant ecological and evolutionary genetics

Professor Ian Reid
ARC Laureate Professor
Director, Robotic Vision
Computer vision for robotics and autonomous vehicles

Professor Chunhua Shen
Director, Machine Learning Theory
Object detection, semantic pixel labelling, and generic image understanding

Professor Javen Qinfeng Shi
Director, Advanced Reasoning and Logic
Probabilistic graphical models, optimisation, and deep learning

Dr Johan Verjans
Deputy Director, Medical Machine Learning
Machine learning in Cardiovascular Disease

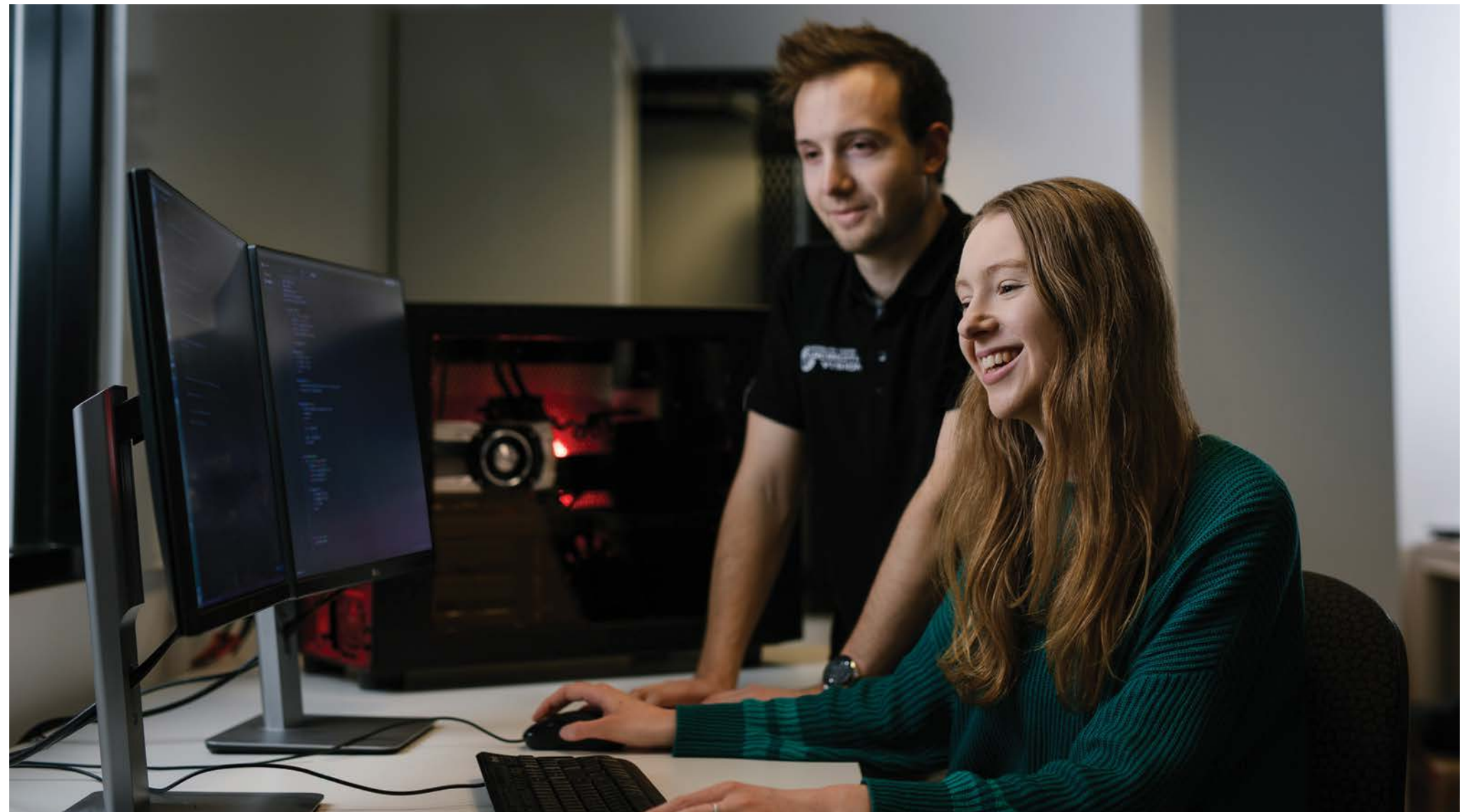
Dr Qi Wu
ARC DECRA Fellow
Director, Vision & Language Methods
Visual Question Answering

AIML Research Team

Dr Álvaro Parra Bustos
Dr Ehsan Abbasnejad
Dr John Bastian
Dr Jiewei Cao
Dr Yuanzhonhan Cao
Dr Bo Chen
Dr Peng Chen
Professor Wojciech Chojnacki
Dr Thanh-Toan Do
Dr Ravi Garg
Dr Dong Gong
Dr Yasir Latif
Dr Stephan Lau
Dr Hui Li
Dr Zhibin Liao
Dr Wei Liu
Dr Gabriel Maicas Suso
Dr Guansong Pang
Dr Pulak Purkait
Dr Yuankai Qi
Dr Hamid Rezaatofighi
Dr Michele Sassdelli
Dr Jamie Sherrah
Dr Zygmunt Szpak
Dr Damien Teney
Dr Peng Wang
Dr Ben Ward
Dr Saroj (Chamara) Weerasekera
Dr Zifeng Wu
Dr Bohan Zhuang

AIML Engineering Team

Sam Bahrami
Alex Cichowski
Karl Hornlund
Aaron Lane
Andrew Leppard
Dr Grant Osborne
Sebastian Parkitny
Philip Roberts
Thomas Rowntree
Kiet To



AIML Research Assistants

James Kortman
Mohammad Mahdi Moghaddam
Gerard Snaauw

AIML Students

Dung Anh Doan
Hossein Askari Lyarjdameh
Bendu Bai
Jiawang Bian
Ming Cai
Zhipeng Cai
Cuong Cao Nguyen
Shizhe Chen
Hao Chen
Xiongren Chen
Shizhe Chen
Yutong Dai
Alessio Del Bue
Mahsa Ehsanpour
Shin Fang Ch'ng
James Faulkner
Rafael Felix Alves
Tong He

Renato Hermoza Aragones
Matthew Howe
Fengxian Hu
Yenan Jiang
Chee Kheng Chng
Jie Li
Kejie Li
Chunlei Liu
Daqi Liu
Yifan Liu
Yu Liu
Yuliang Liu
Wanxuan Lu
Haosen Lui
Qiaoyang Luo
Anthony Manchin
Bahram Mohammadi
Vladimir Nekrasov
Amin Parvaneh
Minming Qian
Shilin Qiu
Ergnoor Shehu
Violetta Shevchenko
Libo Sun
Wei Sun

Yu Tian
Zhi Tian
Cong Wang
Pei Wang
Xu Wang
Hu Wang
Xian Wang
Xinlong Wang
Hai-Ming Xu
Chen Yan
Jie Yang
Jordan Yeomans
Zidu Yin
Wei Yin
Liu Yu
Changqian Yu
Huangying Zhan
Xinyu Zhang
Jianpeng (James) Zhang
Zhun Zhang
Mengyi Zhao
Dandan Zheng
Michael Zhuang
Jinan Zou

AIML Executive Team

Ali Anderson
Outreach Manager
Hilary Brookes
Executive Officer
Dr Paul Dalby
Business Development Manager
Emily Holyoak
Communications and Engagement Manager
Luke Heffernan
Space Business Development Lead
Anna Hurt
Casual Staff
Rachel Kontic
Senior Administrative Officer & EA
Ian Will
Operations Manager

2019 PUBLICATIONS

Abbasnejad E, Wu Q, Shi Q, Van Den Hengel A. What's to know? uncertainty as a guide to asking goal-oriented questions. In: Proc IEEE Conference on Computer Vision and Pattern Recognition (CVPR) Long Beach, USA. Online, 2019/06/01/. pp 4150-4159.

Abbasnejad M, Shi Q, Van Den Hengel A, Liu L. A generative adversarial density estimator. In: Proc A generative adversarial density estimator Long Beach, USA. Online, 2019/06/01/. pp 10774-10783.

Abbasnejad ME, Shi Q, Van Den Hengel A, Liu L. A Generative Adversarial Density Estimator. In: Proc IEEE Conference on Computer Vision and Pattern Recognition (CVPR) Long Beach, USA. Online, 2019. pp 10782-10791.

Abdi M, Lim C, Mohamed S, Nahavandi S, Abbasnejad E, Van Den Hengel A. Discriminative clustering of high-dimensional data using generative modeling. In: Proc IEEE International Midwest Symposium on Circuits and Systems (MWSCAS) Windsor, Canada, 2019. pp 799-802.

Abedin Varamin A, Rezatofighi H, Shi Q, Ranasinghe D. SparseSense: Human Activity Recognition from Highly Sparse Sensor Data-streams Using Set-based Neural Networks. In: Proc International Joint Conference on Artificial Intelligence (IJCAI 2019) Macao, China. Online, 2019/07/01/. pp 5780-5786.

Ansdell M, Ioannou Y, Osborn H, Sasdelli M, Smith J, Caldwell D, Jenkins J, Raissi C, Angerhausen D. Automatic Classification of Transiting Planet Candidates using Deep Learning. In: Proc 28th Annual Conference on Astronomical Data Analysis Software and Systems (ADASS XXVIII) Univ Maryland, Astron Dept, Coll Pk, MD, USA. Online, 2019/01/01/. pp 59-62.

Aoki Y, Goforth H, Srivatsan RA, Lucey S. PointNetLK: Robust & Efficient Point Cloud Registration Using PointNet. In: Proc 2019 IEEE/CVF Conference on Computer Vision and Pattern Recognition (CVPR), 15-20 June 2019, 2019. pp 7156-7165.

Bay A, Sidiropoulos P, Vazquez E, Sasdelli M. Real-time Tracker with Fast Recovery from Target Loss. In: Proc IEEE International Conference on Acoustics, Speech and Signal Processing (ICASSP) Brighton, UK. Online, 2019. pp 1932-1936.

Bian J, Lin W, Liu Y, Zhang L, Yeung S, Cheng M, Reid I. GMS: Grid-Based Motion Statistics for Fast, Ultra-robust Feature

Correspondence. International Journal of Computer Vision 2019.

Bustos AP, Chin TJ, Neumann F, Friedrich T, Katzmann M. A Practical Maximum Clique Algorithm for Matching with Pairwise Constraints. CoRR 2019;abs/1902.01534.

Cai M, Shen C, Reid I. A hybrid probabilistic model for camera relocalization. In: Proc British Machine Vision Conference (BMVC) Newcastle upon Tyne, UK. Online, 2019/01/01/. pp 1-12.

Cai Z, Chin T, Bustos A, Schindler K. Practical optimal registration of terrestrial LiDAR scan pairs. ISPRS Journal of Photogrammetry and Remote Sensing 2019;147:118-131.

Carneiro G, Manuel J, Tavares R, Bradley A, Papa J, Nascimento J, Cardoso J, Lu Z, Belagiannis V. Editorial. Computer Methods in Biomechanics and Biomedical Engineering: Imaging and Visualization 2019;7(3):241.

Carneiro G, You S. Computer Vision – ACCV 2018 Workshops: Springer; 2019.

Carneiro G, You S. Preface. In: Carneiro G, You S, editors. Computer Vision – ACCV 2018 Workshops; 2019. p v-v.

Chang M, Lambert J, Sangkloy P, Singh J, Bak S, Hartnett A, Wang D, Carr P, Lucey S, Ramanan D, Hays J. Argoverse: 3D Tracking and Forecasting With Rich Maps. In: Proc 2019 IEEE/CVF Conference on Computer Vision and Pattern Recognition (CVPR), 15-20 June 2019, 2019. pp 8740-8749.

Chojnacki W, Szpak Z. Determining ellipses from low-resolution images with a comprehensive image formation model. Journal of the Optical Society of America A 2019;36(2):212-233.

Chojnacki W, Szpak Z. Full explicit consistency constraints in uncalibrated multiple homography estimation. In: Proc Asian Conference on Computer Vision (ACCV) Perth, Australia, Switzerland, 2019. pp 659-675.

Chojnacki W. A note on crossed products. Expositions Mathematicae 2019.

Do H, Chin T, Moretti N, Jah M, Tetlow M. Robust foreground segmentation and image registration for optical detection of GEO objects. Advances in Space Research 2019;64(3):733-746.

Do T, Hoang T, Le Tan D, Pham T, Le H, Cheung N, Reid I. Binary constrained deep hashing network for image retrieval without manual annotation. In: Proc 2019 IEEE Winter Conference on Applications of

Computer Vision (WACV) Waikoloa Village, HI, USA. Online, 2019/03/04/. pp 695-704.

Do T, Pham T, Cai M, Reid I. Real-time monocular object instance 6D pose estimation. In: Proc British Machine Vision Conference (BMVC) Newcastle upon Tyne, UK. Online, 2019/01/01/. pp 1-12.

Do TT, Tran T, Reid I, Kumar V, Hoang T, Carneiro G. A theoretically sound upper bound on the triplet loss for improving the efficiency of deep distance metric learning. In: Proc IEEE/CVF Conference on Computer Vision and Pattern Recognition (CVPR) Long Beach, CA, USA, 2019. pp 10396-10405.

Doan A, LatifY, Chin T, Liu Y, Ch'Ng S, Do T, Reid I. Visual Localization under Appearance Change: A Filtering Approach. 2019 Digital Image Computing: Techniques and Applications, DICTA 2019 2019:1-8.

Doan D, LatifY, Chin T, Liu Y, Do T, Reid I. Scalable place recognition under appearance change for autonomous driving. In: Proc IEEE International Conference on Computer Vision (ICCV) Seoul, South Korea. Online, 2019/10/01/. pp 9318-9327.

Duan X, Wu Q, Gan C, Zhang Y, Huang W, Van Den Hengel A, Zhu W. Watch, reason and code: Learning to represent videos using program. In: Proc ACM International Conference on Multimedia (ACM Multimedia) Nice, France. Online, 2019/10/15/. pp 1543-1551.

Felix Alves R, Harwood B, Sasdelli M, Carneiro G. Generalised zero-shot learning with domain classification in a joint semantic and visual space. In: Proc Digital Image Computing: Techniques and Applications (DICTA) Perth, Australia. Online, 2019. pp 1-8.

Felix R, Harwood B, Sasdelli M, Carneiro G. Generalised zero-shot learning with a classifier ensemble over multi-modal embedding spaces. arXiv 2019;OnlinePubl.

Felix R, Harwood B, Sasdelli M, Carneiro G. Generalised Zero-Shot Learning with Domain Classification in a Joint Semantic and Visual Space. 2019 Digital Image Computing: Techniques and Applications, DICTA 2019 2019;abs/1908.04930.

Felix R, Sasdelli M, Reid ID, Carneiro G. Multi-modal Ensemble Classification for Generalized Zero Shot Learning. CoRR 2019;abs/1901.04623.

Gale W, Oakden-Rayner L, Carneiro G, Palmer LJ, Bradley AP. Producing radiologist quality reports for interpretable

deep learning. In: Proc IEEE International Symposium on Biomedical Imaging (ISBI) Venice, ITALY. Online, 2019. pp 1275-1279.

Glaser S, Maicas G, Bedrikovetski S, Sammour T, Carneiro G. Semi-supervised Multi-domain Multi-task Training for Metastatic Colon Lymph Node Diagnosis From Abdominal CT. CoRR 2019;abs/1910.10371.

Goforth H, Lucey S. GPS-Denied UAV Localization using Pre-existing Satellite Imagery. In: Proc 2019 International Conference on Robotics and Automation (ICRA), 20-24 May 2019, 2019. pp 2974-2980.

Gong D, Liu L, Le V, Saha B, Mansour M, Venkatesh S, Van Den Hengel A. Memorizing normality to detect anomaly: Memory-augmented deep autoencoder for unsupervised anomaly detection. In, 2019/10/01/. pp 1705-1714.

Gong D, Tan M, Shi Q, van den Hengel A, Zhang Y. MPTV: matching pursuit based total variation minimization for image deconvolution. IEEE Transactions on Image Processing 2019;28(4):1851-1865.

Guo Y, Chen Q, Chen J, Wu Q, Shi Q, Tan M. Auto-Embedding Generative Adversarial Networks for High Resolution Image Synthesis. IEEE Transactions on Multimedia 2019;21(11):2726-2737.

Hasani-Shoreh M, Ameca-Alducin M, Blaikie W, Neumann F, Schoenauer M. On the behaviour of differential evolution for problems with dynamic linear constraints. In: Proc IEEE Congress on Evolutionary Computation (CEC) Wellington, New Zealand, 2019. pp 3045-3052.

He T, Shen C, Tian Z, Gong D, Sun C, Yan Y. Knowledge adaptation for efficient semantic segmentation. Proceedings of the IEEE Computer Society Conference on Computer Vision and Pattern Recognition 2019;2019-June:578-587.

Hosseinzadeh M, LatifY, Pham T, Suenderhauf N, Reid I. Structure aware SLAM using quadrics and planes. In: Proc Asian Conference on Computer Vision (ACCV) Perth, Australia.

Hosseinzadeh M, Li K, LatifY, Reid I. Real-time monocular object-model aware sparse SLAM. In: Proc IEEE International Conference on Robotics and Automation (ICRA) Montreal, Canada.

Hunter J, Jateff E, van den Hengel A. Using Digital Visualization of Archival Sources to Enhance Archaeological Interpretation of the 'Life History' of Ships: The Case Study of HMCS/HMAS Protector. In: McCarthy JK, Benjamin J, Winton T, van Duivenwoorde W, editors. 3D Recording and Interpretation for Maritime Archaeology. Cham, Switzerland: Springer Nature; 2019. p 89-101.

Jian S, Pang G, Cao L, Lu K, Gao H. CURE: Flexible Categorical Data Representation by Hierarchical Coupling Learning. IEEE Trans Knowl Data Eng 2019;31(5):853-866.

Johnston A, Carneiro G. Single View 3D Point Cloud Reconstruction using Novel View Synthesis and Self-Supervised Depth Estimation. In: Proc Digital Image Computing Techniques and Applications (DICTA) Perth, Australia. Online, 2019/12/01/. pp 1-8.

Kellett J, Barreto R, Van Den Hengel A, Vogiatzis N. How Might Autonomous Vehicles Impact the City? The Case of Commuting to Central Adelaide. URBAN POLICY AND RESEARCH 2019;37(4):442-457.

Kong C, Lucey S. Deep Non-Rigid Structure From Motion. In: Proc 2019 IEEE/CVF International Conference on Computer Vision (ICCV), 27 Oct.-2 Nov. 2019, 2019. pp 1558-1567.

Li H, Wang P, Shen C, Van Den Hengel A. Visual question answering as reading comprehension. In: Proc IEEE Conference on Computer Vision and Pattern Recognition (CVPR) Long Beach, USA. Online, 2019/06/01/. pp 6312-6321.

Li H, Wang P, Shen C, Zhang G. Show, Attend and Read: A Simple and Strong Baseline for Irregular Text Recognition. In: Proc 33rd AAAI Conference on Artificial Intelligence; 31st Conference on Innovative Applications of Artificial Intelligence; 9th Symposium on Educational Advances in Artificial Intelligence Honolulu, HI, USA. Online, 2019. pp 8610-8617.

Li H, Wang P, Shen C. Toward End-to-End Car License Plate Detection and Recognition With Deep Neural Networks. IEEE Transactions on Intelligent Transportation Systems 2019;20(3):1126-1136.

Li J, Liu Y, Gong D, Shi Q, Yuan X, Zhao C, Reid I. RGBD based dimensional decomposition residual network for 3D semantic scene completion. In: Proc IEEE Conference on Computer Vision and Pattern Recognition (CVPR) Long Beach, USA. Online, 2019/06/01/. pp 7685-7694.

Li R, Gong D, Sun J, Zhu Y, Wei Z, Zhang Y. Robust and Accurate Hybrid Structure-From-Moti. In: Proc IEEE International Conference on Image Processing (ICIP) Taipei, Taiwan. Online, 2019/09/01/. pp 494-498.

Li R, Xian K, Shen C, Cao Z, Lu H, Hang L. Deep Attention-Based Classification Network for Robust Depth Prediction. In: Proc 14th Asian Conference on Computer Vision, ACCV 2018 Perth, Western Australia. Online, 2019. pp 663-678.

Li X, Zhao L, Ji W, Wu Y, Wu F, Yang M, Tao D, Reid I. Multi-Task Structure-Aware Context Modeling for Robust Keypoint-Based Object Tracking. IEEE Transactions on Pattern Analysis and Machine Intelligence 2019;41(4):915-927.

Lin C, Wang O, Russell BC, Shechtman E, Kim VG, Fisher M, Lucey S. Photometric Mesh Optimization for Video-Aligned 3D Object Reconstruction. In: Proc 2019 IEEE/CVF Conference on Computer Vision and

Pattern Recognition (CVPR), 15-20 June 2019, 2019. pp 969-978.

Liu H, Ji R, Wang J, Shen C. Ordinal constraint binary coding for approximate nearest neighbor search. IEEE Transactions on Pattern Analysis and Machine Intelligence 2019;41(4):941-955.

Liu J, Zhang Y, Zhang L, Xie F, Vasileff A, Qiao S. Graphitic carbon nitride (g-C₃N₄)-derived N-rich graphene with tuneable interlayer distance as a high-rate anode for sodium-ion batteries. Advanced Materials 2019;31(24):e1901261-e1901261.

Liu W, Gong D, Tan M, Shi Q, Yang Y, Hauptmann A. Learning Distilled Graph for Large-scale Social Network Data Clustering. IEEE Transactions on Knowledge and Data Engineering 2019.

Liu W, Li Y, Wu Q. An Attribute-Based High-Level Image Representation for Scene Classification. IEEE Access 2019;7:4629-4640.

Liu Y, Dong W, Zhang L, Gong D, Shi Q. Variational bayesian dropout with a hierarchical prior. In: Proc IEEE Conference on Computer Vision and Pattern Recognition (CVPR) Long Beach, USA. Online, 2019/06/01/. pp 7117-7126.

Liu Y, Tian Y, Maicas G, Pu LZ, Singh R, Verjans JW, Carneiro G. Photoshopping Colonoscopy Video Frames. CoRR 2019;abs/1910.10345.

Lu H, Dai Y, Shen C, Xu S. Indices matter: Learning to index for deep image matting. Proceedings of the IEEE International Conference on Computer Vision 2019;2019-October:3265-3274.

Lu L, Wang X, Carneiro G, Yang L. Preface; 2019. v-vii p.

Lyu F, Wu Q, Hu F, Wu Q, Tan M. Attend and Imagine: Multi-Label Image Classification with Visual Attention and Recurrent Neural Networks. IEEE Transactions on Multimedia 2019;21(8):1971-1981.

Maicas G, Bradley A, Nascimento J, Reid I, Carneiro G. Deep Reinforcement Learning for Detecting Breast Lesions from DCE-MRI. In: Lu L, Wang X, Carneiro G, Yang L, editors. Deep Learning and Convolutional Neural Networks for Medical Imaging and Clinical Informatics. Cham, Switzerland: Springer; 2019. p 163-178.

Maicas G, Bradley AP, Nascimento JC, Reid I, Carneiro G. Pre and post-hoc diagnosis and interpretation of malignancy from breast DCE-MRI. Medical Image Analysis 2019;58(101562):101562-101561-101562-101514.

Maicas Suso G, Snaauw G, Bradley AP, Reid I, Carneiro G. Model agnostic saliency for weakly supervised lesion detection from breast DCE-MRI. In: Proc IEEE International Symposium on Biomedical Imaging (ISBI) Venice, ITALY. Online, 2019. pp 1057-1060.

Manchin A, Abbasnejad E, van den Hengel A. Reinforcement Learning with Attention that Works: A Self-Supervised Approach. *Communications in Computer and Information Science* 2019;1143 CCIS:223-230.

Manchin A, Abbasnejad E, Van Den Hengel A. Reinforcement learning with attention that works: a self-supervised approach. In: *Proc International Conference on Neural Information Processing (ICONIP)* Sydney, 2019. pp 223-230.

Nekrasov V, Chen H, Shen C, Reid I. Fast neural architecture search of compact semantic segmentation models via auxiliary cells. *Proceedings of the IEEE Computer Society Conference on Computer Vision and Pattern Recognition* 2019;2019-June:9118-9127.

Nekrasov V, Chen H, Shen C, Reid ID. Architecture Search of Dynamic Cells for Semantic Video Segmentation. *CoRR* 2019;abs/1904.02371.

Nekrasov V, Chen H, Shen C, Reid ID. Fast Neural Architecture Search of Compact Semantic Segmentation Models via Auxiliary Cells. *CVPR* 2019:9126-9135.

Nekrasov V, Dharmasiri T, Spek A, Drummond T, Shen C, Reid I. Real-time joint semantic segmentation and depth estimation using asymmetric annotations. In: *Proc IEEE International Conference on Robotics and Automation (ICRA)* Montreal, Canada, 2019. pp 7101-7107.

Nekrasov V, Shen C, Reid ID. Template-Based Automatic Search of Compact Semantic Segmentation Architectures. *CoRR* 2019;abs/1904.02365.

Neshat M, Abbasnejad E, Shi Q, Alexander B, Wagner M. Adaptive Neuro-Surrogate-Based Optimisation Method for Wave Energy Converters Placement Optimisation. *ICONIP* (2) 2019;11954:353-366.

Nguyen H, Chesser M, Koh L, Rezatofighi SH, Ranasinghe D. TrackerBots: autonomous unmanned aerial vehicle for real-time localization and tracking of multiple radio-tagged animals. *Journal of Field Robotics* 2019;36(3):617-635.

Nguyen HV, Rezatofighi H, Vo BN, Ranasinghe DC. Multi-Objective Multi-Agent Planning for Jointly Discovering and Tracking Mobile Object. In, 2019.

Oakden-Rayner L, Dunnmon J, Carneiro G, Ré C. Hidden Stratification Causes Clinically Meaningful Failures in Machine Learning for Medical Imaging. *CoRR* 2019;abs/1909.12475.online, 2019. pp 7123-7129. online, 2019/05/01/. pp 2385-2391.

Pahuja A, Lucey S. Lossy GIF Compression Using Deep Intrinsic Parameterization. In: *Proc 2019 IEEE/CVF International Conference on Computer Vision Workshop (ICCVW)*, 27-28 Oct. 2019, 2019. pp 4581-4583.

Pang G, Shen C, Van Den Hengel A. Deep anomaly detection with deviation networks. In: *Proc ACM SIGKDD International*

Conference on Knowledge Discovery & Data Mining (KDD) Anchorage, AK, New York, 2019/07/25/. pp 353-362.

Parra Bustos A, Chin T, Eriksson A, Reid I. Visual SLAM: Why bundle adjust? In: *Proc International Conference on Robotics and Automation (ICRA)* Montreal, Canada.

Parvaneh A, Abbasnejad E, Wu Q, Shi J. Show, price and negotiate: a hierarchical attention recurrent visual negotiator. *arXiv* 2019;OnlinePubl.

Pena G, Kuang B, Szpak Z, Cowled P, Dawson J, Fitridge R. Evaluation of a Novel Three-Dimensional Wound Measurement Device for Assessment of Diabetic Foot Ulcers. *ADVANCES IN WOUND CARE* 2019.

Peng X, Zhu H, Feng J, Shen C, Zhang H, Zhou JT. Deep Clustering With Sample-Assignment Invariance Prior. *IEEE transactions on neural networks and learning systems* 2019.

Pu LZCT, Maicas G, Tian Y, Yamamura T, Singh G, Rana K, Suzuki H, Nakamura M, Hirooka Y, Burt A, Fujishiro M, Carneiro G, Singh R. Prospective study assessing a comprehensive computer-aided diagnosis for characterization of colorectal lesions: Results from different centers and imaging technologies. In, 2019/09/01/. pp 25-26.

Purkait P, Zach C, Reid I. Seeing behind Things: Extending Semantic Segmentation to Occluded Regions. In: *Proc IEEE/RSJ International Conference on Intelligent Robots and Systems (IROS)* Macau, China. Online, 2019/11/01/. pp 1998-2005.

Rezatofighi H, Tsoi N, Gwak J, Sadeghian A, Reid ID, Savarese S. Generalized Intersection Over Union: A Metric and a Loss for Bounding Box Regression. In: *Proc IEEE Conference on Computer Vision and Pattern Recognition (CVPR)* Long Beach, USA. Online, 2019. pp 658-666.

Rowntree T, Pontecorvo C, Reid I. Real-Time Human Gaze Estimation. In: *Proc Digital Image Computing Techniques and Applications (DICTA)* Perth, Australia. Online, 2019/12/01/. pp 1-7.

Snaauw G, Gong D, Maicas G, van den Hengel A, Niessen WJ, Verjans J, Carneiro G. End-to-end diagnosis and segmentation learning from cardiac magnetic resonance imaging. In: *Proc IEEE International Symposium on Biomedical Imaging (ISBI)* Venice, Italy. Online, 2019. pp 802-805.

Suwanwimolkul S, Zhang L, Gong D, Zhang Z, Chen C, Ranasinghe D, Qinfeng Shi J. An adaptive markov random field for structured compressive sensing. *IEEE Transactions on Image Processing* 2019;28(3):1556-1570.

Suwanwimolkul S, Zhang L, Ranasinghe D, Shi Q. One-step adaptive Markov random field for structured compressive sensing. *Signal Processing* 2019;156:116-144. Switzerland, 2019. pp 410-426.

Tchapmi L, Kosaraju V, Reid I, Rezatofighi H, Savarese S. Topnet: Structural point cloud decoder. In: *Proc IEEE Conference on*

Computer Vision and Pattern Recognition (CVPR) Long Beach, USA. Online, 2019/06/01/. pp 383-392.

Teney D, Abbasnejad E, Hengel AVD. On Incorporating Semantic Prior Knowledge in Deep Learning Through Embedding-Space Constraints. *CoRR* 2019;abs/1909.13471.

Teney D, Van Den Hengel A. Actively seeking and learning from live data. *Proceedings of the IEEE Computer Society Conference on Computer Vision and Pattern Recognition* 2019;2019-June:1940-1949.

Teney D, Van Den Hengel A. Actively Seeking and Learning From Live Data. In: *Proc IEEE Conference on Computer Vision and Pattern Recognition (CVPR)* Long Beach, USA. Online, 2019. pp 1940-1949.

Teney D, Wang P, Cao J, Liu L, Shen C, Hengel AVD. V-PROM: A Benchmark for Visual Reasoning Using Visual Progressive Matrices. *CoRR* 2019;abs/1907.12271.

Tian Y, Pu LZ, Singh R, Burt AD, Carneiro G. One-stage five-class polyp detection and. In: *Proc IEEE International Symposium on Biomedical Imaging (ISBI)* Venice, ITALY. Online, 2019/01/01/. pp 70-73.

Tian Z, He T, Shen C, Yan Y. Decoders matter for semantic segmentation: Data-dependent decoding enables flexible feature aggregation. *Proceedings of the IEEE Computer Society Conference on Computer Vision and Pattern Recognition* 2019;2019-June:3121-3130.

Tian Z, Shen C, Chen H, He T. FCOS: Fully convolutional one-stage object detection. *Proceedings of the IEEE International Conference on Computer Vision* 2019;2019-October:9626-9635.

Tran T, Do T, Reid I, Carneiro G. Bayesian generative active deep learning. In, 2019/01/01/. pp 10969-10978.

Tran T, Do TT, Reid I, Carneiro G. Bayesian Generative Active Deep Learning. In: *Proc International Conference on Machine Learning (IMCL)* Long Beach, USA. Online, 2019/05/28/. pp 6295-6304.

Verjans J, Veldhuis W, Carneiro G, Wolterink J, Išgum I, Leiner T. Cardiovascular diseases. In: *Ranschaert ER, Morozov S, Algra PR, editors. Artificial Intelligence in Medical Imaging: Opportunities, Applications and Risks.* Cham, Switzerland: Springer; 2019. p 167-185.

Wang C, Kong C, Lucey S. Distill Knowledge From NRSIM for Weakly Supervised 3D Pose Learning. In: *Proc 2019 IEEE/CVF International Conference on Computer Vision (ICCV)*, 27 Oct.-2 Nov. 2019, 2019. pp 743-752.

Wang C, Lucey S, Perazzi F, Wang O. Web Stereo Video Supervision for Depth Prediction from Dynamic Scenes. In: *Proc 2019 International Conference on 3D Vision (3DV)*, 16-19 Sept. 2019, 2019. pp 348-357.

Wang P, Liu L, Shen C, Shen H. Order-aware convolutional pooling for video based action recognition. *Pattern Recognition* 2019;91:357-365.

Wang P, Wu Q, Cao J, Shen C, Gao L, Hengel A. Neighbourhood watch: Referring expression comprehension via language-guided graph attention networks. In, 2019/06/01/. pp 1960-1968.

Wang X, Liu S, Shen X, Shen C, Jia J. Associatively segmenting instances and semantics in point clouds. *Proceedings of the IEEE Computer Society Conference on Computer Vision and Pattern Recognition* 2019;2019-June:4091-4100.

Ward B, Brien C, Oakey H, Pearson A, Negrão S, Schilling R, Taylor J, Jarvis D, Timmins A, Roy S, Tester M, Berger B, Van Den Hengel A. High-throughput 3D modelling to dissect the genetic control of leaf elongation in barley (*Hordeum vulgare*). *The Plant Journal* 2019;98(3):555-570.

Weerasekera C, Garg R, Latif Y, Reid I. Learning Deeply Supervised Good Features to Match for Dense Monocular Reconstruction. In: *Proc Asian Conference on Computer Vision, ACCV* 2018 Perth, Australia, Switzerland, 2019. pp 609-624.

Wei X, Wang P, Liu L, Shen C, Wu J. Piecewise Classifier Mappings: Learning Fine-Grained Learners for Novel Categories with Few Examples. *IEEE Transactions on Image Processing* 2019;28(12):6116-6125.

Wei X, Zhang C, Liu L, Shen C, Wu J. Coarse-to-fine: A RNN-based hierarchical attention model for vehicle re-identification. In: *Proc Asian Conference on Computer Vision (ACCV)* Perth, Australia, Switzerland, 2019. pp 575-591.

Wei X, Zhang C, Wu J, Shen C, Zhou Z. Unsupervised object discovery and co-localization by deep descriptor transformation. *Pattern Recognition* 2019;88:113-126.

Wu Z, Shen C van den Hengel A. Wider or Deeper: Revisiting the ResNet Model for Visual Recognition. *Pattern Recognition* 2019;90:119-133.

Xie F, Zhang L, Gu Q, Chao D, Jaroniec M, Qiao S. Multi-shell hollow structured Sb₂S₃ for sodium-ion batteries with enhanced energy density. *Nano Energy* 2019;60:591-599.

Xie Y, Lu H, Zhang J, Shen C, Xia Y. Deep segmentation-emedation model for gland instance segmentation. In: *Proc Medical Image Computing and Computer-Assisted Intervention (MICCAI)* Shenzhen, China. Switzerland, 2019/01/01/. pp 469-477.

Xiong H, Cao Z, Lu H, Madec S, Liu L, Shen C. TasselNetv2: in-field counting of wheat spikes with context-augmented local regression networks. *Plant Methods* 2019;15(1):150-151-150-114.

Xu W, Liu W, Chi H, Qiu S, Jin Y. Self-paced learning with privileged information. *Neurocomputing* 2019;362:147-155.

Yan C, Pang G, Bai X, Shen C, Zhou J, Hancock E. Deep hashing by discriminating hard examples. In: *Proc ACM International Conference on Multimedia (MM)* Nice, France. Online, 2019/10/15/. pp 1535-1542.

Yan Q, Gong D, Shi Q, Van Den Hengel A, Shen C, Reid I, Zhang Y. Attention-guided network for ghost-free high dynamic range imaging. In: *Proc IEEE Conference on Computer Vision and Pattern Recognition (CVPR)* Long Beach, USA. Online, 2019/06/01/. pp 1751-1760.

Yan Q, Gong D, Zhang P, Shi Q, Sun J, Reid I, Zhang Y. Multi-scale dense networks for deep high dynamic range imaging. In: *Proc IEEE Winter Conference on Applications of Computer Vision (WACV)* Waikoloa Village, HI, USA, 2019. pp 41-50.

Yan Q, Gong D, Zhang Y. Two-Stream Convolutional Networks for Blind Image Quality Assessment. *IEEE Transactions on Image Processing* 2019;28(5):2200-2211.

Yan Y, Huang Y, Chen S, Shen C, Wang H. Joint Deep Learning of Facial Expression Synthesis and Recognition. *IEEE Transactions on Multimedia* 2019.

Yao R, Lin G, Shen C, Zhang Y, Shi Q. Semantics-Aware Visual Object Tracking. *IEEE Transactions on Circuits and Systems for Video Technology* 2019;29(6):1687-1700.

Yin W, Liu Y, Shen C, Yan Y. Enforcing geometric constraints of virtual normal for depth prediction. *Proceedings of the IEEE International Conference on Computer Vision* 2019;2019-October:5683-5692.

Zakizadeh R, Qian Y, Sasdelli M, Vazquez E. Instance Retrieval at Fine-Grained Level Using Multi-attribute Recognition. In: *Proc 2018 14th International Conference on Signal-Image Technology & Internet-Based Systems (SITIS)* Las Palmas de Gran Canaria, Spain. Online, 2019. pp 442-448.

Zhan H, Weerasekera C, Garg R, Reid I. Self-supervised learning for single view depth and surface normal estimation. In: *Proc International Conference on Robotics and Automation (ICRA)* Montreal, Canada. Online, 2019/05/01/. pp 4811-4817.

Zhang H, Li Y, Jiang Y, Wang P, Shen Q, Shen C. Hyperspectral Classification Based on Lightweight 3-D-CNN with Transfer Learning. *IEEE Transactions on Geoscience and Remote Sensing* 2019;57(8):5813-5828.

Zhang H, Shen C, Li Y, Cao Y, Liu Y, Yan Y. Exploiting temporal consistency for real-time video depth estimation. *Proceedings of the IEEE International Conference on Computer Vision* 2019;2019-October:1725-1734.

Zhang J, Wu Q, Zhang J, Shen C, Lu J, Wu Q. Heritage image annotation via collective knowledge. *Pattern Recognition* 2019;93:204-214.

Zhang J, Wu Q, Zhang J, Shen C, Lu J. Mind your neighbours: Image annotation with metadata neighbourhood graph co-attention networks. In: *Proc IEEE Conference on Computer Vision and Pattern Recognition (CVPR)* Long Beach, USA. Online, 2019/06/01/. pp 2951-2959.

Zhang J, Xie Y, Wu Q, Xia Y. Medical image classification using synergic deep learning. *Medical Image Analysis* 2019;54:10-19.

Zhang J, Xie Y, Xia Y, Shen C. Attention residual learning for skin lesion classification. *IEEE Transactions on Medical Imaging* 2019;38(9):2092-2103.

Zhang J, Xie Y, Zhang P, Chen H, Xia Y, Shen C. Light-weight hybrid convolutional network for liver tumor segmentation. In: *Proc International Joint Conference on Artificial Intelligence (IJCAI)* Macao, China. Online, 2019/01/01/. pp 4271-4277.

Zhang L, Wang P, Wei W, Lu H, Shen C, van den Hengel A, Zhang Y. Unsupervised domain adaptation using robust class-wise matching. *IEEE Transactions on Circuits and Systems for Video Technology* 2019;29(5):1339-1349.

Zhang L, Wei W, Shi Q, Shen C, van den Hengel A, Zhang Y. Accurate Tensor Completion via Adaptive Low-Rank Representation. *IEEE transactions on neural networks and learning systems* 2019.

Zhang L, Wei W, Shi Q, Shen C, van den Hengel A, Zhang Y. Accurate imagery recovery using a multi-observation patch model. *Information Sciences* 2019;501:724-741.

Zhang P, Liu W, Lei Y, Lu H. Hyperfusion-Net: Hyper-densely reflective feature fusion for salient object detection. *Pattern Recognition* 2019;93:521-533.

Zhang P, Liu W, Lu H, Shen C. Salient object detection with lossless feature reflection and weighted structural loss. *IEEE Transactions on Image Processing* 2019;28(6):3048-3060.

Zhang P, Liu W, Wang H, Lei Y, Lu H. Deep gated attention networks for large-scale street-level scene segmentation. *Pattern Recognition* 2019;88:702-714.

Zhang T, Ji P, Harandi M, Hartley R, Reid I. Scalable deep k-subspace clustering. In: *Proc Asian Conference on Computer Vision (ACCV)* Perth, Australia, Switzerland, 2019. pp 466-481.

Zhang T, Lin G, Cai J, Shen T, Shen C, Kot A. Decoupled Spatial Neural Attention for Weakly Supervised Semantic Segmentation. *IEEE Transactions on Multimedia* 2019;21(11):2930-2941.

Zhang X, Cao J, Shen C, You M. Self-training with progressive augmentation for unsupervised cross-domain person re-identification. *Proceedings of the IEEE International Conference on Computer Vision* 2019;2019-October:8221-8230.

Zhuang B, Shen C, Tan M, Liu L, Reid I. Structured binary neural networks for accurate image classification and semantic segmentation. In: *Proc IEEE Conference on Computer Vision and Pattern Recognition (CVPR)* Long Beach, USA. Online, 2019/06/01/. pp 413-422.

FOR FURTHER ENQUIRIES

Australian Institute for Machine Learning
The University of Adelaide SA 5005 Australia

ENQUIRIES aiml@adelaide.edu.au

 adelaide.edu.au/aiml

 twitter.com/TheAIML

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