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Brains on Board Project Showcase Report









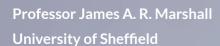


Foreword

As the Brains on Board project ends its final year, I am happy to share with you this final overview of the project, to summarise its objectives and achievements. It has been my pleasure to lead the project during its five years. These years have seen a number of highlights, such as groundbreaking research papers, and the formation of a successful deep tech university spinout. Inevitably the years have also given us some notable lowlights, particularly the COVID-19 pandemic which was so disruptive to people's lives, and of the work of the project, for a prolonged period.

Brains on Board set out with a bold and broad ambition, to simultaneously conduct basic research into the behaviour of insects and how their brains generate that behaviour, and into reverse engineering insect brains to design novel artificial brains for robotics and autonomous systems, that function much more robustly and efficiently than existing approaches. In doing so, advances in both experimental and modelling techniques would also be required. We thus set our team a series of challenging targets. In reading this report I hope you will agree with my assessment, that the hard work and ingenuity of its researchers has made substantial progress to realising the original lofty goals of the Brains on Board research project.

Choosing highlights from a project of the scale of Brains on Board is always challenging; here, alongside the overview of the project, we present five highlights, one for each year of the project, that represent the breadth and ambition of the work done. I hope you will find reading about the Brains on Board project as interesting as it has been to see it developing first-hand.



Introduction

What if we could design an autonomous robot brain with the navigational and learning abilities of a honeybee? Such a computationally and energy-efficient autonomous system would represent a step-change for robotics technology, and is precisely what the 'Brains on Board' project set out to achieve Autonomous control of mobile robots requires robustness to environmental and sensory uncertainty, and the flexibility to deal with novel environments and scenarios. Animals solve these problems through having flexible brains capable of unsupervised pattern detection and learning. Even 'small'brained animals like bees exhibit sophisticated learning and navigation abilities using very efficient brains of only up to 1 million neurons, 100,000 times fewer than in a human brain. Crucially, these mini-brains nevertheless support high levels of multi-tasking and they are adaptable, within the lifetime of an individual, to completely novel scenarios; this is in marked contrast to typical engineering solutions.

Funded by EPSRC as a £4.8m, five year Programme Grant, the Brains on Board project drew together the Universities of Sheffield, Sussex and Queen Mary University of London, in fusing computational and experimental neuroscience, animal behaviour, and robotics in order to develop a ground-breaking new class of highly efficient 'brain on board' robot controllers, able to exhibit adaptive behaviour while running on very lightweight, low power computing hardware.

The Brains on Board project was structured around five research projects, distributed across the three partner universities, integrating into a sixth research project taking the form of a robot demonstrator for the developed technology.

RESEARCH PROJECT	DESCRIPTION	PARTNERS
1	Investigate the neural bases of honeybee visual perception and flight control, using virtual reality simulators	Sheffield, QMUL
2	Investigate what bees see and how they move during exploration and learning, using 3d harmonic radar and high speed videography	QMUL, Sheffield, Sussex
3	Derive efficient algorithms for appearance-based visual learning and navigation	Sussex, QMUL
4	Develop and test neural models of multi-modal sensory learning and action selection	Sussex, Sheffield
5	Build hardware- and model-aware neural simulation tools for GPU processors	Sussex, Sheffield
6	Build an on-board real-time controller for autonomous flying robots	Sheffield, Sussex, QMUL





The University of Sheffield

Sheffield was the lead institution for Brains on Board, having responsibility for experimental work with free-flying bees undertaking behavioural experiments, tethered bees interacting with virtual reality environments (see Highlight 1) and neural recordings from the bee visual system. Leading the final integrative Research Project 6, Sheffield also worked on the development of a bespoke quadcopter platform suitable for mounting GPU-based brains-on-board controllers, including the design and fabrication of a sophisticated new stabilised multi-camera system. Other contributions were made in the area of insect-eye modelling (see Highlight 3), and in commercialisation of Brains on Board research via the establishment of Opteran Technologies (see Highlight 4).



The University of Sussex

Sussex was the key informatics project partner alongside The University of Sheffield, while also providing critical biological expertise on insect navigation, and learning. As well as developing and refining brain-inspired algorithms in these areas, Sussex made key contributions in demonstrating the utility of GPUs for large-scale neural simulation (see Highlight 2), in developing a framework for streamlined integration of brain models with robotic platforms ('BoB Robotics'), and in developing ground-based platforms for proof-of-principle demonstrations of its navigation algorithms, including integrating technology from project spinout Opteran Technologies.



Queen Mary University of London

Queen Mary provided the Brains on Board project with expertise in bee flight and learning behaviour, and developed cutting edge technology to track free-flying bees in landscape-scale natural environments (see Highlight 5). Key contributions included data on bee flight traces from this harmonic radar system, which shed light on a number of questions such as what large-scale landscape features bees use during navigation, as well as small scale high-speed video data helping uncover the visual information bees use to control their flight behaviour. Further contributions included studies on social transfer of learned behaviour between bees, and what simple tricks bees are likely to use when apparently doing cognitive tasks such as 'counting'.

Media Highlights

Coverage of the project and of Opteran Technologies:

- 'Die as a human or live forever as a cyborg': Will robots rule the world? Sydney Morning Herald, July 19th 2021
- ABC Radio, May 3rd 2021

Coverage of the paper 'Nonnumerical strategies used by bees to solve numerical cognition tasks':

- Bees able to solve maths tests despite not understanding numbers, researchers find. The Independent. February 17th 2021
- Honeybees can solve maths tests without using numbers. The Engineer, February 3rd 2021
- BBC Radio Sheffield, February 17th 2021

Coverage of the paper 'Larger GPU-accelerated brain simulations with procedural connectivity':

- Video game graphics cards can simulate monkey brains on the cheap. New Scientist, February 1st 2021
- Researchers run monkey brain simulation usually restricted to supercomputers on commercial PCs. iNews, February 2nd 2021
- Video games were 'Eureka!' moment that helped boffins simulate neural activity on a single commodity GPU. The Register, February 3rd 2021

Coverage of the project's attendance at the UKRI VIP Reception at the AAAS Meeting, Seattle:

- Scientists look to bees to develop drone technology.

 The Financial Times. February 16th 2020
- Bees help drones to find their bearings. *The Times*, February 17th 2020
- Bees are being mapped to help develop driverless cars and drones by scientists gluing tiny antennas to their heads. *The Telegraph*. February 17th 2020.
- Tiny antennae that record how bees navigate between flowers may help perfect steering systems for driverless cars and drones, scientists reveal. The Daily Mail. February 17th 2020
- Sky News, February 18th 2020

Coverage of the project:

- Jimmy's Big Bee Rescue, Channel 4, September 5th 2020
- The One Show, BBC, March 6th 2020
- RAI 2. November 4th 2018
- Reuters, June 5th 2018
- CBC News, April 10th 2018
- BBC World Service, February 8th 2018





Team

Past and present members of the Brains on Board team:

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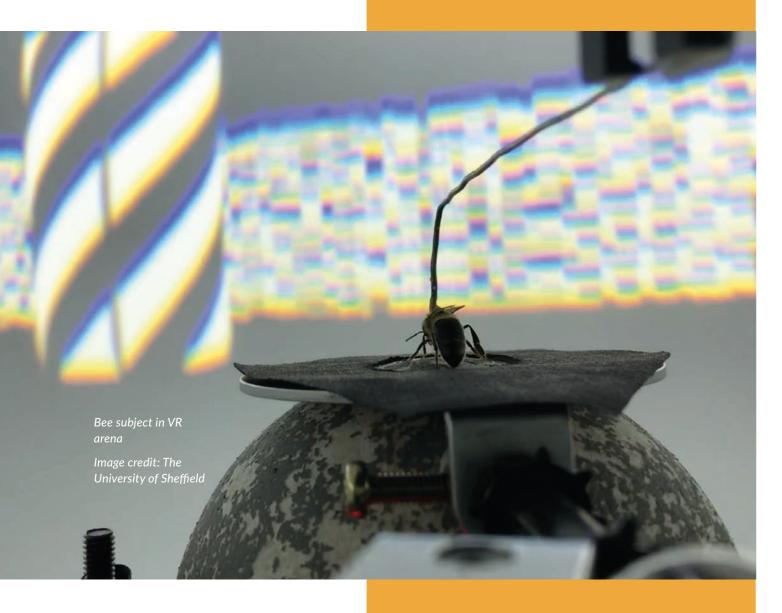
University of Sheffield

Carla Teale, University of Sheffield

Dr Vera Vasas,

Queen Mary University of London







Physical arena for subjects to explore before going into VR

Image credit: The University of Sheffield

HIGHLIGHT 1

Bees in VR

The study of animal navigation behaviour in virtual reality brings a number of advantages; behaviour can be tracked in greater detail, manipulations of the world to test navigation models, such as teleportation, can be done in a way that cannot in the real world, and neural recording from navigating animals becomes much more feasible. Accordingly, the Brains on Board project developed an advanced VR projection system for walking bees, and a pla to move this towards a flight simulator environment.

colony, and have access to a physical analogue of the VR environment for exploration and familiarisation. Movable physical landmarks corresponding to those used in VR enable bees to localise rewarding sucrose solution, or punishing heat, in order to learn the desired task - this can then be tested in VR.



A Titan RTX GPU card; Brains on Board research showed how one of these could equal the performance of 8 custom neuromorphic processor boards from a dedicated brain simulation supercomputer.

Image credit: NVidia

HIGHLIGHT 2

Supercomputerbeating neural simulation

Much of the recent deep learning revolution was enabled by faster simulations, in particular using Graphics Processing Units (GPUs) as general purpose accelerator hardware for simulating artificial neural networks.

Though it is an obvious idea to do the same with biologically more plausible spiking neural networks (SNNs), developers of existing SNN simulators have struggled to add GPU accelerator support. During Brains on Board we further developed the GeNN software that optimizes and deploys spiking neural network models for GPU accelerators.

We were able to show that a cortical microcircuit benchmark model runs as fast on a single GPU as on the fastest classical HPC configuration and faster than on the SpiNNaker neuromorphic supercomputer. Subsequently, we extended the capabilities of GeNN to also support even larger models by just-in-time connectivity generation, and ran the so-called multi-area model with 4 million neurons and 24 billion synapses on a single GPU - something previously only possible on large supercomputers.

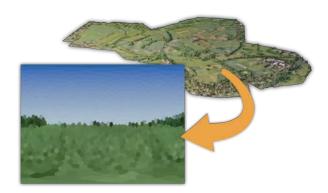
GeNN models can be deployed on a wide range of systems from supercomputers to embedded systems. The embedded systems support can underpin live robotics, allowing us to emulate bio-inspired brains-on-board algorithms in real time and in the real world.

HIGHLIGHT 3

Insect-eye rendering

Have you ever wondered what an ant sees? Or perhaps pondered the sights a bumble bee experiences as it weaves its way around towering buildings? Or maybe you have found yourself quoting the ubiquitous phrase "to be a fly on the wall". It is easy to imagine that an insect sees the world much as we do, but just somehow smaller

However, in reality insects see a vastly different world to us, and yet insects can understand this information with ease using brains smaller than a grain of rice. To do this they use a myriad of tricks - for instance, did you know that it can actually be easier to work out where you are when you look at something through a blurry lens as opposed to a super-high definition image? As scientists, we want to understand these tricks so that we can use them in our own autonomous robots. To do this we built an open-source computer graphics program that uses state-of-the-art raytracing hardware to accurately re-create the view from any compound eye imaginable, allowing us to search through thousands of eye designs to find out what makes them tick. The things we learn can then help us design better, more efficient robotic vision systems, as well as forward our understanding of one of the most successful groups of animals on the planet.



A 3d reconstruction of the field site where we track real bees (see Highlight 5) enables us to reproduce insect-eye views of what they see during flight.

Image credit: University of Sheffield

HIGHLIGHT 4

Commercial impact

The Brains on Board impact plan included the proposal to establish a spinout from project research. In March 2020 this was successfully realised, with the spinout of Opteran Technologies Ltd from the University of Sheffield, co-founded by team members James Marshall and Alex Cope, complemented with the recruitment of CEO David Rajan. Opteran closed over £2m of seed funding in November 2020, led by IQ Capital, alongside Seraphim, Episode 1 and Join. At eighteen employees already, including a number of former project members, Opteran is on a steep growth trajectory, showing how human-engineered approaches to autonomy will be outperformed by reverse-engineering natural brains.





The 'Green Hornet' drone flies fully autonomously under the control of the Opteran Development Kit, which deploys algorithms initially derive during the Brains on Board project.



HIGHLIGHT 5

Bee tracking

Bees face a daunting navigational challenge, which has much in common with the challenges facing humans and robots: to explore an unpredictable landscape, discover and learn the locations of places of interest - such as the nest, food sources, etc - and devise efficient, robust ways to move between them. Learning how and where bees move helps us understand the strategies they use to meet these challenges with only a tiny brain - but keeping track of small insects over large distances poses quite a challenge to us.



We have recently developed a new type of harmonic radar, which tracks movement in three, not just two dimensions. We use our harmonic radar to track bee flight at a landscape scale. The radar scans through 360° every three seconds, emitting a powerful radio signal. A lightweight transponder attached to the bee emits a response signal allowing us to pinpoint its location.

We tracked bumblebees as they explored the landscape on their first ever flights, then challenged them to find their way home from an unfamiliar location. Examination of 3D flight paths will allow us to look at how they learn what their nest looks like from different heights and how that affects their homing ability (see Highlight 3).

An example of a bee's long-distance flight path, captured with harmonic radar tracking technology.

Image credit: Queen Mary University of London



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The Brains on Board project has developed, or contributed to, a number of open-source projects. Highlights include:

- BoB Robotics: provides code for interfacing with various robot platforms and other associated hardware, as well as code for running simulations and visualising data (https://brainsonboard.github.io/bob_robotics/)
- Compound Ray: cutting edge ray-tracing technology to accurately recreate the visual perspective of different insect eyes at unprecedented speed (https://github.com/BrainsOnBoard/compound-ray)
- GeNN: GPU-enhanced Neuronal Network simulation environment based on code generation for Nvidia CUDA (http://genn-team.github.io/genn/)
- SpineML / SpineCreator: modelling language and graphical tool for neural modelling; code generates to a variety of platforms including GeNN (http://spineml.github.io)

Data Availability Statement

 Metadata describing data collected by the Brains on Board project were logged at DataCite, with open access datasets being published via FigShare

Cover image: BeeBot v2, designed to carry an NVidia Jetson mobile GPU and bespoke panoramic camera system reproducing insect vision.

Cover image credit: AMRC

