



NOTE TO SELF:
DON'T PANIC AND CARRY A TOWEL

$$6 \times 9 = 42$$

A brief introduction to swarm intelligence

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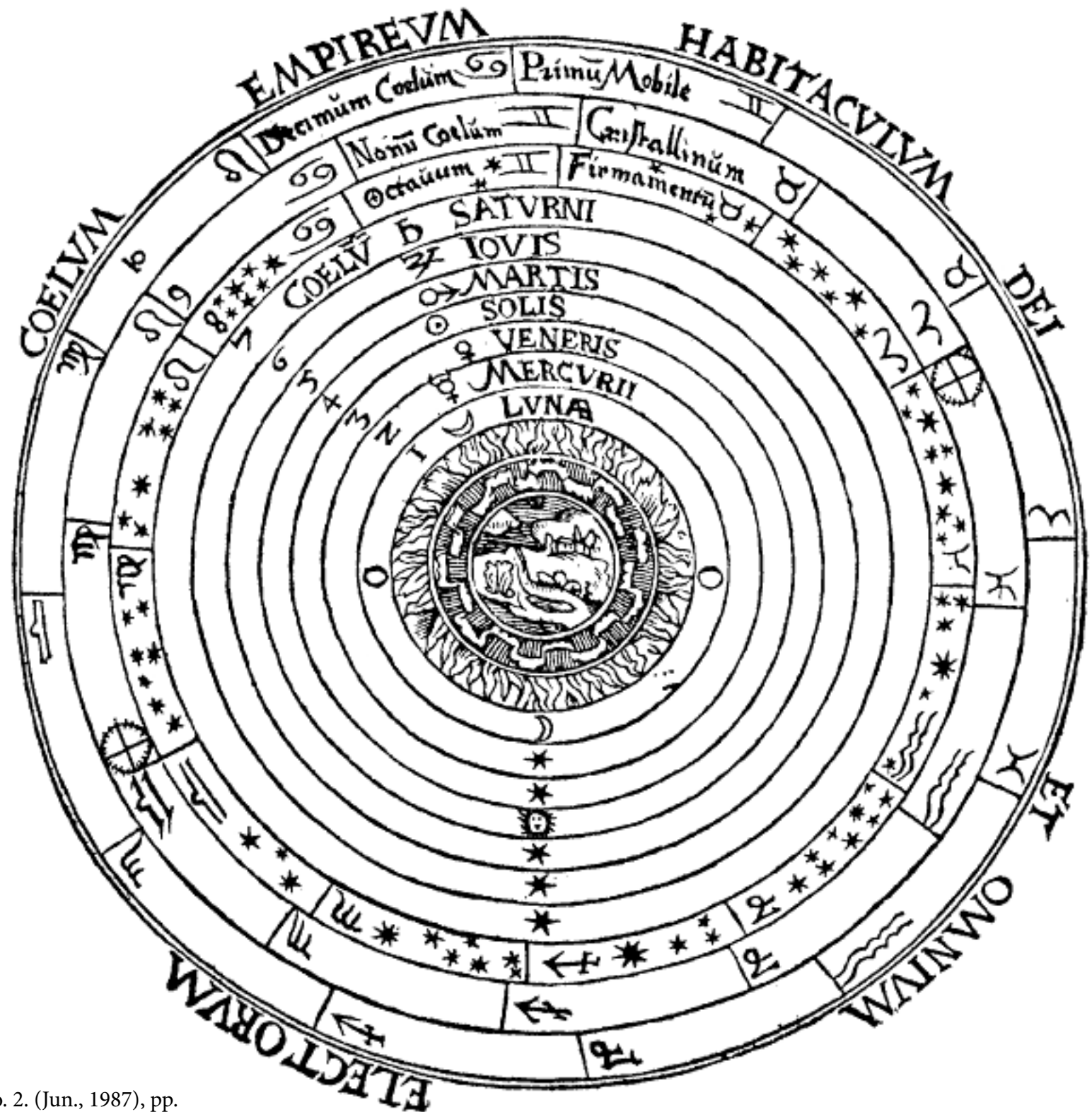


INTELLECTUS (NOUS)

Capacity for

- logic
- abstract thought
- understanding
- self-awareness
- communication
- learning
- emotional knowledge
- memory
- planning
- creativity and problem solving

Schema huius præmissæ diuisionis Sphærarum .



Source:

From Edward Grant, "Celestial Orbs in the Latin Middle Ages", Isis, Vol. 78, No. 2. (Jun., 1987), pp. 152-173.



INTELLIGENCE IN NATURE

Animals

- Human
- Non-human - g Factor
 - Vertabrates: *Mammals, birds, reptiles, fish*
 - Cephalopods
 - Arthropods

Plants - *Perception?*

Neuroscience and intelligence

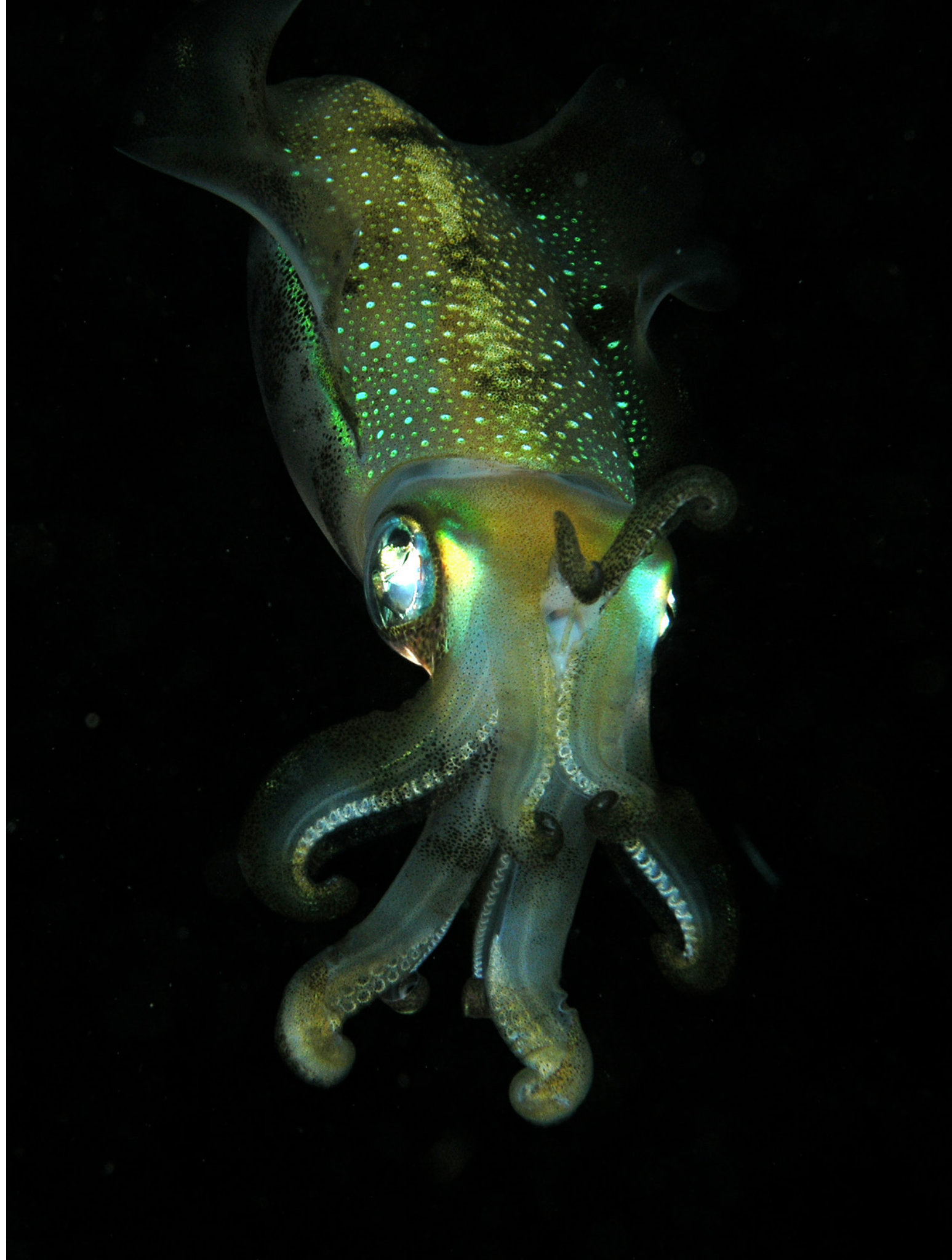
Human

- Brain volume
- Grey matter
- White matter
- Cortical thickness
- Neural efficiency

Primate

- Brain size

Brain-to-body mass ratio





ARTIFICIAL INTELLIGENCE

Practopoiesis

Conceptual bridge between biological and artificial intelligence.

- Weak AI
- Strong AI

AI-hard or AI-complete

Artificial agent



A LI'L HISTORY

-360

Aristotle described the syllogism, a method of formal, mechanical thought.

1206

Al-Jazari created a programmable orchestra of mechanical human beings

1600

René Descartes proposed that bodies of animals are nothing more than complex machines

1642

Blaise Pascal invented the mechanical calculator, the first digital calculating machine

1769

Wolfgang von Kempelen built and toured with his chess-playing automaton, The Turk

1913

Bertrand Russell and Alfred North Whitehead published Principia Mathematica, which revolutionized formal logic

1931

Kurt Gödel, father of theoretical computer science

1950

Alan Turing proposes the Turing Test as a measure of machine intelligence

1997

The Deep Blue chess machine (IBM) defeats the (then) world chess champion, Garry Kasparov

2005

Blue Brain is born, a project to simulate the brain at molecular detail

2011

IBM's Watson computer defeated television game show Jeopardy! champions Rutter and Jennings

2011

Apple's Siri, Google's Google Now and Microsoft's Cortana are smartphone apps that use natural language to answer questions, make recommendations and perform actions



■ AI TOOLS

Search and optimization

Search algorithm, Mathematical optimization and Evolutionary computation

Logic

Logic programming and Automated reasoning

Probabilistic methods for uncertain reasoning

Bayesian network, Hidden Markov model, Kalman filter, Decision theory and Utility theory

Classifiers and statistical learning methods

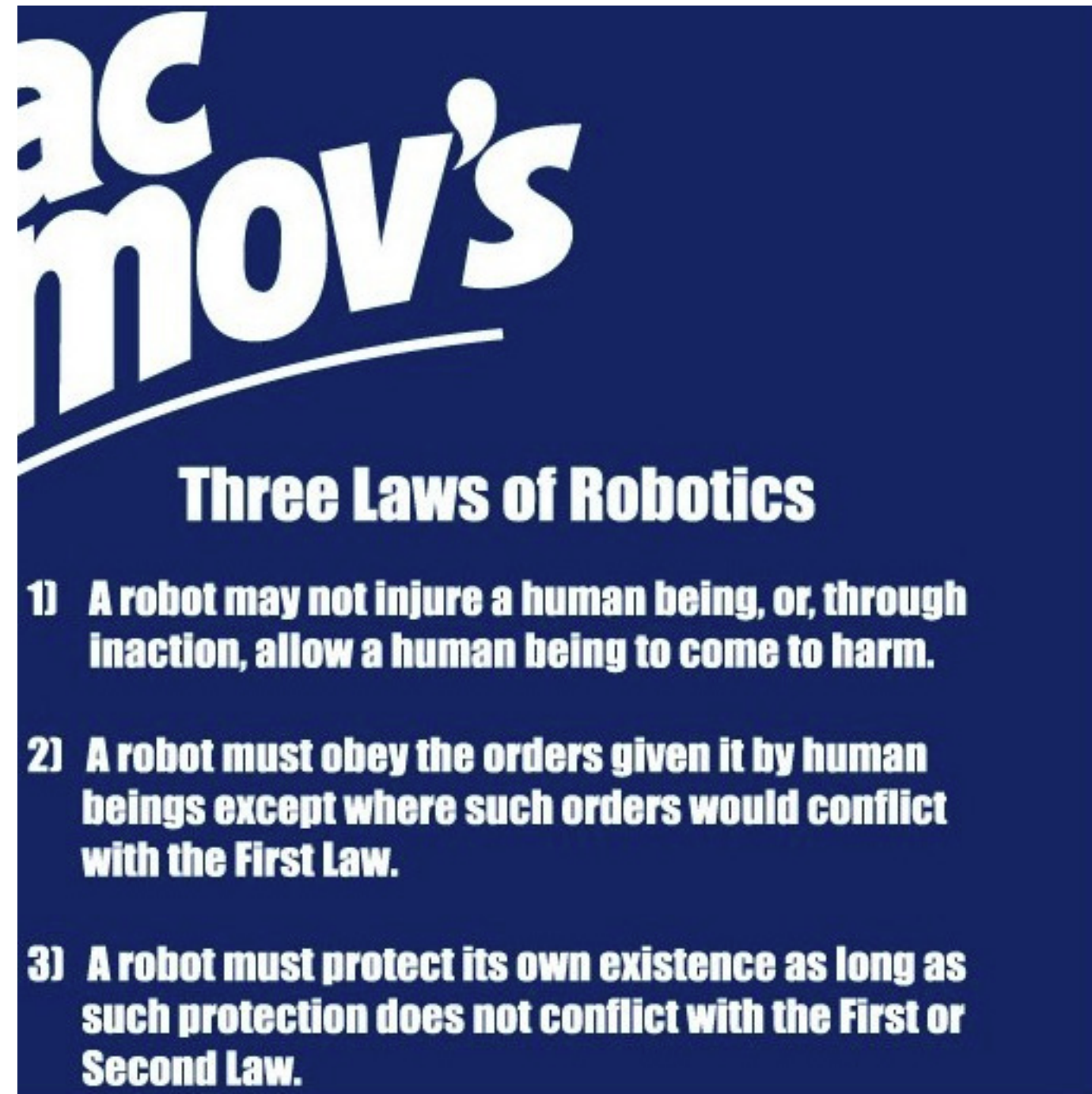
Classifier (mathematics), Statistical classification and Machine learning

Neural networks

Artificial neural network and Connectionism

Control theory

Languages



In the radio series and the first novel, a group of hyper-intelligent pan-dimensional beings demand to learn the

Answer to the Ultimate Question of Life, The Universe, and Everything

from the supercomputer, Deep Thought, specially built for this purpose. It takes Deep Thought 7½ million years to compute and check the answer, which turns out to be **42**. Deep Thought points out that the answer seems meaningless because the beings who instructed it never actually knew what the Question was.

The Ultimate Question:

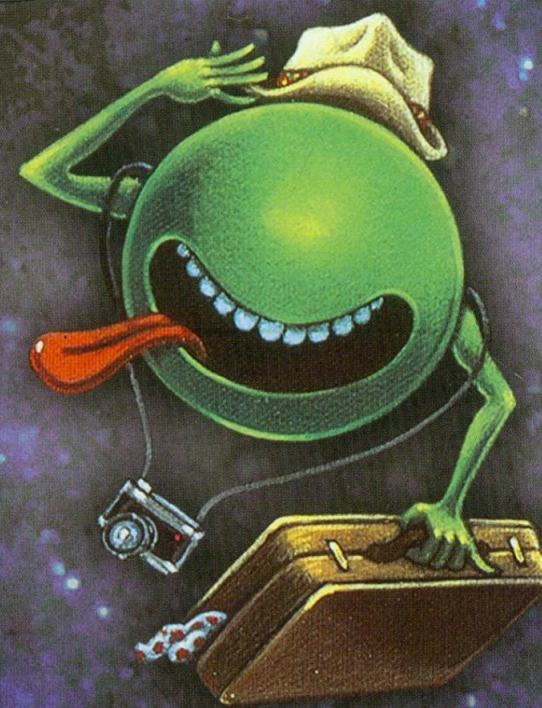
What do you get if you multiply six by nine?

The Answer:

$$6_{13} \times 9_{13} = 42_{13}$$

FIVE NOVELS IN ONE OUTRAGEOUS VOLUME

DOUGLAS ADAMS



THE ULTIMATE HITCHHIKER'S GUIDE TO THE GALAXY

SWARM INTELLIGENCE

Swarm intelligence (SI) is the collective behavior of decentralized, self-organized systems, natural or artificial. Introduced by Gerardo Beni and Jing Wang in 1989, in the context of cellular robotic systems.

Examples in natural systems of SI:

- Ant colonies
- Bird flocking
- Animal herding
- Bacterial growth
- Fish schooling
- Microbial intelligence

Inspiration from Nature

1. Social Insects

- Natural Navigation
- Natural Clustering
- Natural construction

2. Foraging

3. Flocking





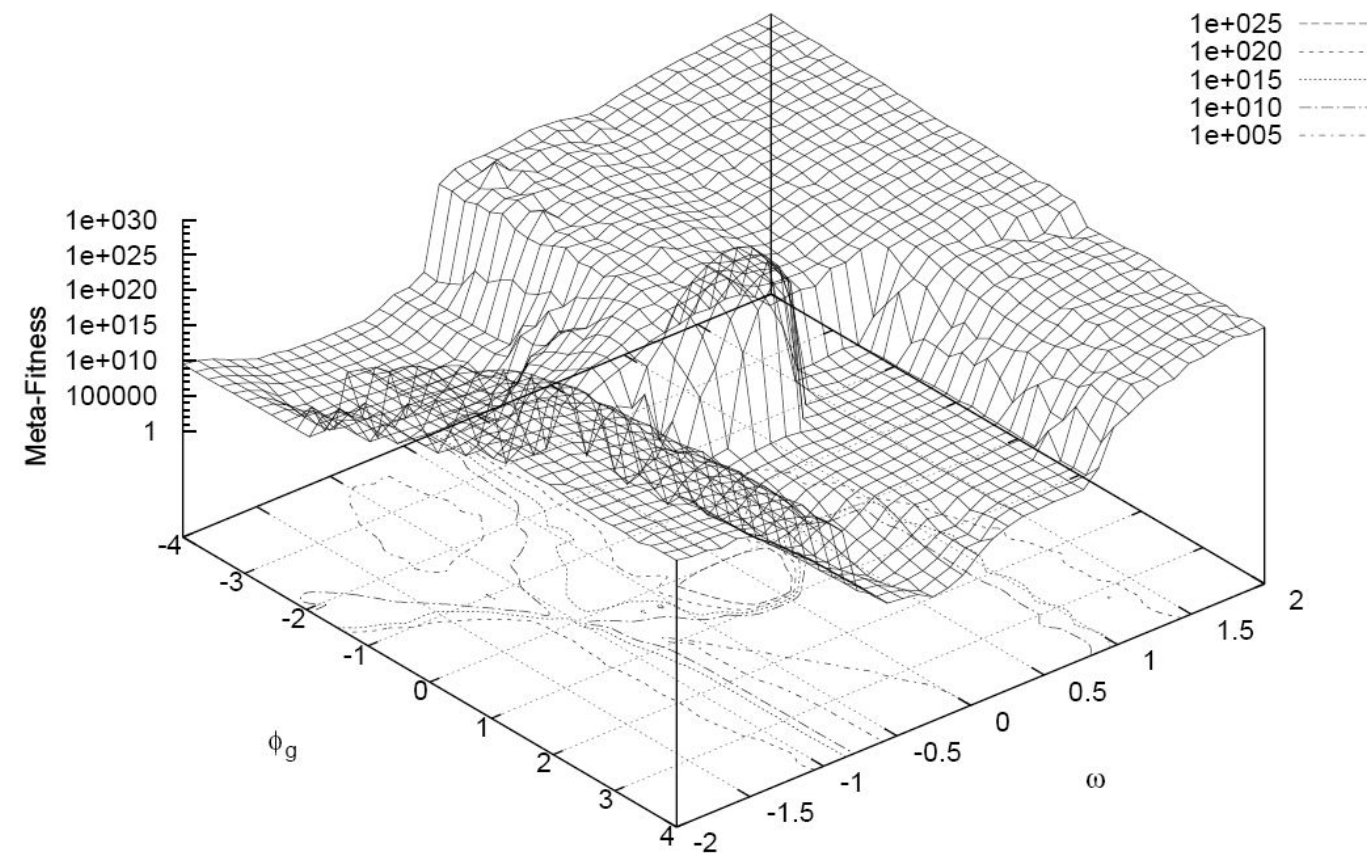
ALGORITHMS

Nature Inspired Search Techniques

Particle swarm optimization

Simulating social behaviour.

- Kennedy, J.; Eberhart, R. (1995). “Particle Swarm Optimization”. Proceedings of IEEE International Conference on Neural Networks IV. pp. 1942–1948.
- Shi, Y.; Eberhart, R.C. (1998). “A modified particle swarm optimizer”. Proceedings of IEEE International Conference on Evolutionary Computation. pp. 69–73.
- Kennedy, J. (1997). “The particle swarm: social adaptation of knowledge”. Proceedings of IEEE International Conference on Evolutionary Computation. pp. 303–308.



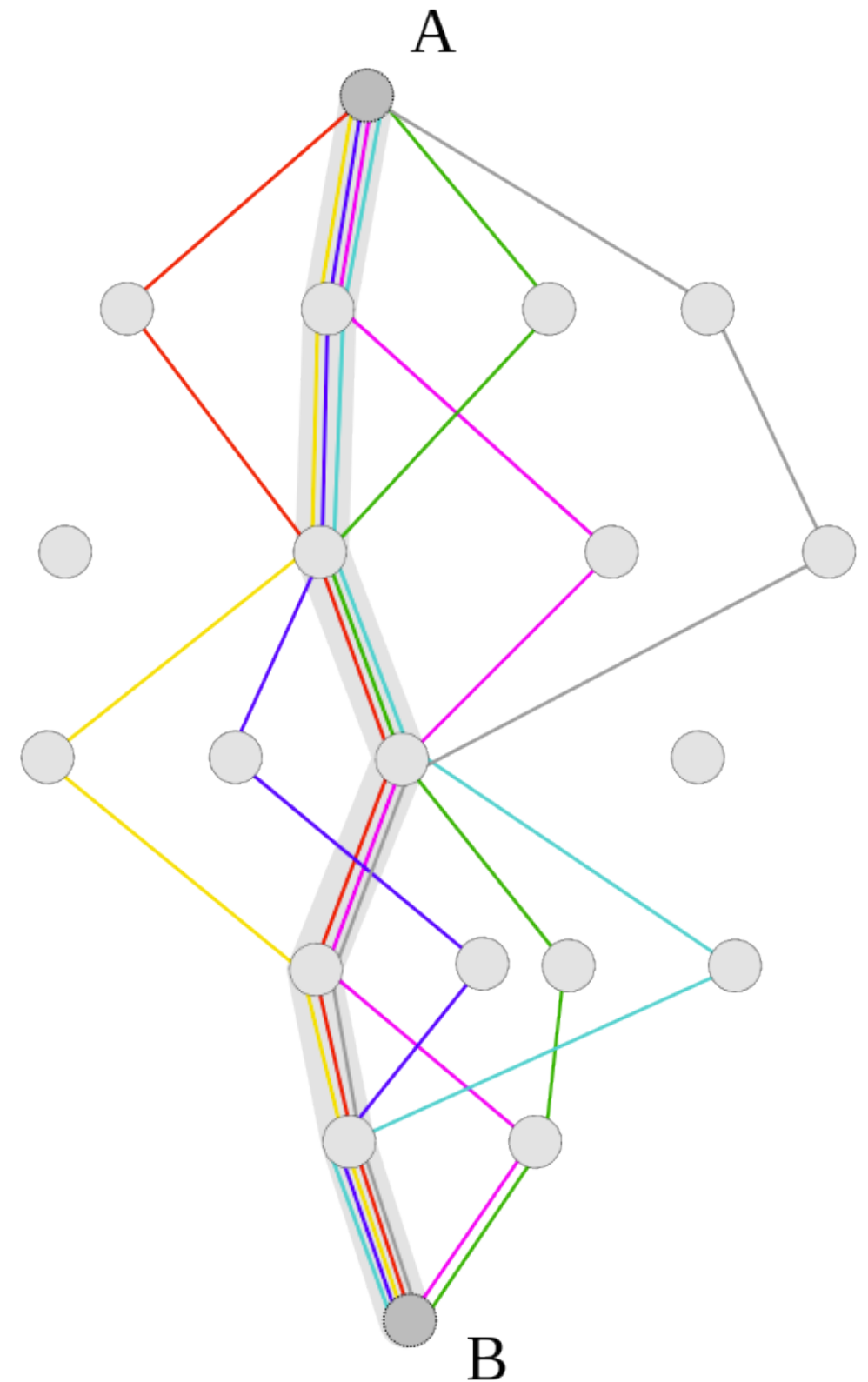
Source:

Pedersen, M.E.H., Tuning & Simplifying Heuristical Optimization, PhD Thesis, 2010, University of Southampton, School of Engineering Sciences, Computational Engineering and Design Group.

Ant colony optimization

A probabilistic technique in metaheuristic optimizations.

- A. Coloni, M. Dorigo et V. Maniezzo, Distributed Optimization by Ant Colonies, actes de la première conférence européenne sur la vie artificielle, Paris, France, Elsevier Publishing, 134-142, 1991.
- M. Dorigo, Optimization, Learning and Natural Algorithms, PhD thesis, Politecnico di Milano, Italy, 1992.



■ ALGORITHMS

Artificial bee colony algorithm

Intelligent foraging behaviour.

- D. Dervis Karaboga, An Idea Based On Honey Bee Swarm for Numerical Optimization, Technical Report-TR06, Erciyes University, Engineering Faculty, Computer Engineering Department 2005.

Multi-level thresholding

MR brain image classification

Face pose estimation

Differential evolution

A method that optimizes a problem by iteratively trying to improve a candidate solution.

- Storn, R.; Price, K. (1997). “Differential evolution - a simple and efficient heuristic for global optimization over continuous spaces”. *Journal of Global Optimization* 11: 341–359..
- Storn, R. (1996). “On the usage of differential evolution for function optimization”. *Biennial Conference of the North American Fuzzy Information Processing Society (NAFIPS)*. pp. 519–523.

Parallel computing

Multiobjective optimization

Constrained optimization

■ ALGORITHMS

The bees algorithm

A population-based search algorithm

- Pham DT, Ghanbarzadeh A, Koc E, Otri S, Rahim S and Zaidi M. The Bees Algorithm. Technical Note, Manufacturing Engineering Centre, Cardiff University, UK, 2005.
- Pham, D.T., Castellani, M. (2009), The Bees Algorithm – Modelling Foraging Behaviour to Solve Continuous Optimisation Problems. Proc. ImechE, Part C, 223(12), 2919-2938.
- Pham, D.T. and Castellani, M. (2013), Benchmarking and Comparison of Nature-Inspired Population-Based Continuous Optimisation Algorithms, Soft Computing, 1-33.

Optimisation of classifiers/Clustering systems

Manufacturing

Bioengineering

Multi-objective optimization

Artificial immune systems

A class of computationally intelligent systems. Adaptive systems.

- J.D. Farmer, N. Packard and A. Perelson, (1986) “The immune system, adaptation and machine learning”, Physica D, vol. 2, pp. 187–204.

Bioinformatics

Bat algorithm

A metaheuristic optimization algorithm.

- X. S. Yang, A New Metaheuristic Bat-Inspired Algorithm, in: Nature Inspired Cooperative Strategies for Optimization (NISCO 2010) (Eds. J. R. Gonzalez et al.), Studies in Computational Intelligence, Springer Berlin, 284, Springer, 65-74 (2010).

Engineering design

Classifications of gene expression data

Glowworm swarm optimization

The algorithm makes the agents glow at intensities approximately proportional to the function value being optimized.

- K.N. Krishnanand and D. Ghose (2005). Detection of multiple source locations using a glowworm metaphor with applications to collective robotics. IEEE Swarm Intelligence Symposium, Pasadena, California, USA, pp. 84- 91.
- K.N. Krishnanand and D. Ghose. (2006). Glowworm swarm based optimization algorithm for multimodal functions with collective robotics applications. Multi-agent and Grid Systems, 2(3):209- 222.
- K.N. Krishnanand and D. Ghose. (2009). Glowworm swarm optimization for simultaneous capture of multiple local optima of multimodal functions. Swarm Intelligence, 3(2):87- 124.
- K.N. Krishnanand and D. Ghose. (2008). Theoretical foundations for rendezvous of glowworm-inspired agent swarms at multiple locations. Robotics and Autonomous Systems, 56(7):549- 569.

■ ALGORITHMS

Gravitational search algorithm

Based on the law of gravity and the notion of mass interactions.

- Rashedi, E.; Nezamabadi-pour, H.; Saryazdi, S. (2009). “GSA: a gravitational search algorithm”. *Information Science* 179 (13): 2232–2248.

Self-propelled particles

Predict robust emergent behaviours occur in swarms independent of the type of animal that is in the swarm.

- Buhl, J.; Sumpter, D. J. T.; Couzin, D.; Hale, J. J.; Despland, E.; Miller, E. R.; Simpson, S. J. (2006). “From disorder to order in marching locusts” (PDF). *Science* 312 (5778): 1402–1406.

Stochastic diffusion search

An agent-based probabilistic global search and optimization technique best suited to problems where the objective function can be decomposed into multiple independent partial-functions.

A comprehensive mathematical framework.

- Bishop, J.M., *Stochastic Searching Networks*, Proc. 1st IEE Int. Conf. on Artificial Neural Networks, pp. 329–331, London, UK, (1989).

Multi-swarm optimization

Use of multiple sub-swarms instead of one (standard) swarm.

Multi-swarm system effectively combines components from Particle swarm optimization, Estimation of distribution algorithm, and Differential evolution into a multi-swarm hybrid.