

Adaptive Systems

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COGS

Behaviour-based Robotics

An action-oriented approach

▄ **Behaviour-based robotics** describes a design methodology for robots based mainly on Brooks' layered architecture (1986), but applicable also to other areas (such as schema-based design). As other action-oriented approaches it emphasizes the relevance of situatedness, embodiment and dynamics.

▄ Roughly inspired in biology.

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- ▄ Everyday action in real environments (low level, but interesting capabilities, e.g., safe navigation),
- ▄ Fast, reactive (or quasi-reactive) behaviour.
- ▄ Interaction between levels of competence
- ▄ Questioning the assumptions behind the traditional design methodology
- ▄ Avoiding complex processing involved in maintaining world models
- ▄ Precursors: Grey Walter, Moravec, Raibert

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Instead of ...



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Why not ...

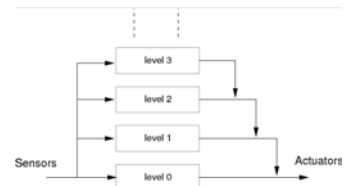


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Levels of competence

▄ Conceptual design representing a specification of the robot's desired behaviours.



▄ They separate what the robot should be able to do into levels. E.g., robot should be able to avoid obstacles, but also to explore, pick up interesting objects, etc.

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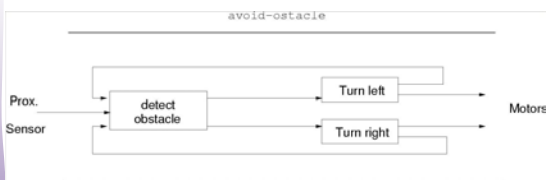
Key points

- Each *level of competence* is implemented as a *control layer* in the robot architecture
- Layers can be built incrementally from the most basic level up.
- Competences remain present all the time, even though they can be inhibited/modified under special circumstances.

Layers of control

- Layers composed of simple asynchronous modules (finite state machines in original cases).
- Build more basic layers first.
- Make them work. (Debug them.)
- "Freeze" them
- Build next layer on top of existing ones

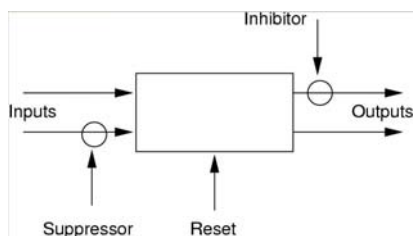
Obstacle avoidance



Coordination

- Coordination between layers through:
 - Inhibition:** Outgoing signals from a module are inhibited
 - Reset:** The internal state of a module is restarted
 - Suppression:** the input to a module is suppressed and replaced by a different signal

Coordination



Coordination

- Low-bandwidth internal communication
- Message passing via machine registers
- Fixed topology (no plasticity)
- Output of lower layer accessible by higher levels (but not the other way around in principle)
- Effective communication through the world itself.

Hexapod robot

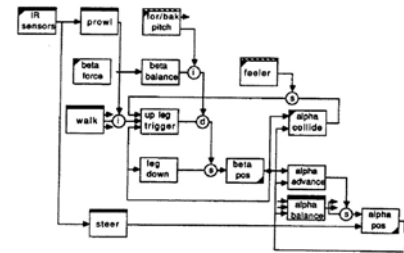
- ⌘ Genghis (1989): walks over rough terrain, follows people. 12 motors, 12 force sensors, 6 pyroelectric sensors, 1 inclinometer and 2 whiskers.



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- ⌘ Distributed control, layers working in parallel.



- ⌘ (Triangles at the top = sensor, triangles at the bottom = effectors, bars = coordinating modules for all 6 legs. Alpha = advance, Beta = balance)

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Schema-based robotics

- ⌘ R. Arkin *Behaviour-based robotics*, MIT Press, 1998).
- ⌘ Reactive control -- Schema-based
- ⌘ **Schema**: Basic unit of motor behaviour from which complex actions can be constructed.
- ⌘ Motor schemas (behaviours) are selected to enable the robot to interact successfully with unexpected events while satisfying higher-level goals.

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Schema-based robotics

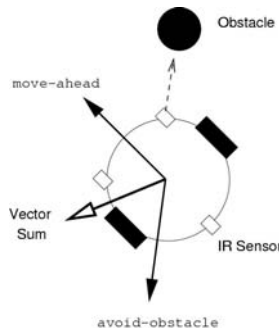
- ⌘ No explicit planning
- ⌘ Multiple active schemas present, each produces a velocity vector driving the robot in response to sensory stimulus.
- ⌘ Vectors are summed to give a single velocity.
- ⌘ Continually updated. No explicit arbitration between schemas (as in subsumption architecture)

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Examples of schemas

- avoid-static-obstacle
- move-to-goal
- stay-on-path
- noise (move at random)
- probe (move towards most open space)
- escape



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Parameters for schemas

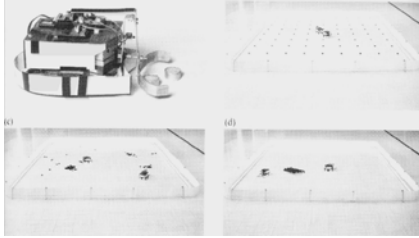
- ⌘ E.g., move-to-goal, avoid-obstacle, and noise, controlled by five parameters:
 - **goal gain** - strength for approaching goal
 - **obstacle gain** - strength with which move away from obstacle
 - **obstacle sphere of influence** - distance from obstacle at which robot is repelled
 - **noise gain** - amplitude of random wandering
 - **noise persistence** - number of time steps the noise vector is held constant
- ⌘ Schemas largely hand-designed but GAs can be used to tune parameters effectively.

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Collective action

- Beckers et al. 1994. Inspiration from social insects. Stigmergy (Grasse, 1959) "incitement to work by the products of work".



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Collective action

- Basic behaviours:
 - Move in a straight line
 - Avoid hitting into other robots and walls by random turning
 - Push up to 3 pucks (Mind the body!)
 - Drop them if pushing more than three

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Precursors

- Grey Walter Tortoises (50s) (Holland, 1996)
- Tolman's Sowbug (1939) (Endo & Arkin, 2001)
- Braitenberg vehicles (80s)

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Grey Walter

Principal behaviours:

- Cycloidal wandering (both motors)
- Phototaxis (driving motor only)
- Dazzle (both motors active at diff. level)
- Avoid obstacle (similar to dazzle)

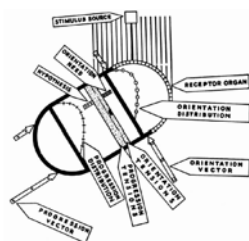


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Tolman's sowbug

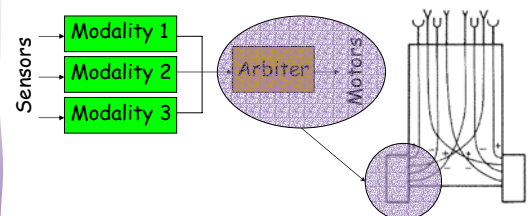
- 1939! Braitenberg like architecture with internal states such as motivation
- Orientation and Progression vectors
- Able to do simple learning



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B-Vehicles as schema-based



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Is BBR reactive?

- ⌘ Most of the time it is considered to be so.
- ⌘ However, internal modules in the control layers may change state so there is no in-principle reason why the architecture as it is should be confined to reactive behaviour.
- ⌘ It is mostly a question of timescales. Internal modules change state at a relatively fast timescale. Hence little chance of long-term plasticity.

Questions

- ⌘ How will this methodology scale?
- ⌘ Design gets harder as you try to scale up. Can't keep track of the effect of different parameters.
- ⌘ How about human level cognition? (In fact, how about a dog, an iguana, a fly?)
- ⌘ Should we care?

Questions

- ⌘ D. Kirsh ("Today the earwig, tomorrow man?"): concepts equal symbolic computation, a non-symbolic approach cannot get you to human level intelligence.
- ⌘ Brooks ("From earwigs to humans") recognizes problems, but bets on soundness of approach. Human intelligence requires a humanoid body, (COG project and others).
- ⌘ Is artificial evolution a possible answer to some of these problems?