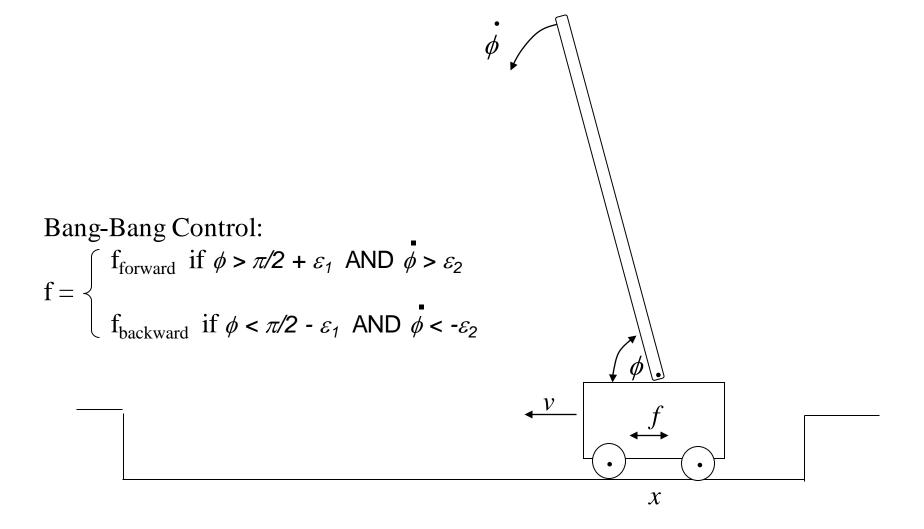
# Pole-Balancing (Cart-Pole System) (balancing an inverted pendulum)



#### "proportional controller"

linear mapping between *n* sensor values and *m* actor controls

$$\mathbf{s} = (s_i)_{i=1..n}$$
 vector of sensor values (f.ex. light intensities)  $\mathbf{a} = (a_i)_{i=1..m}$  " actor control values (f.ex. motor voltages)

 $\mathbf{K} = (k_{i,j})_{i=1..m, j=1..n}$  controller matrix

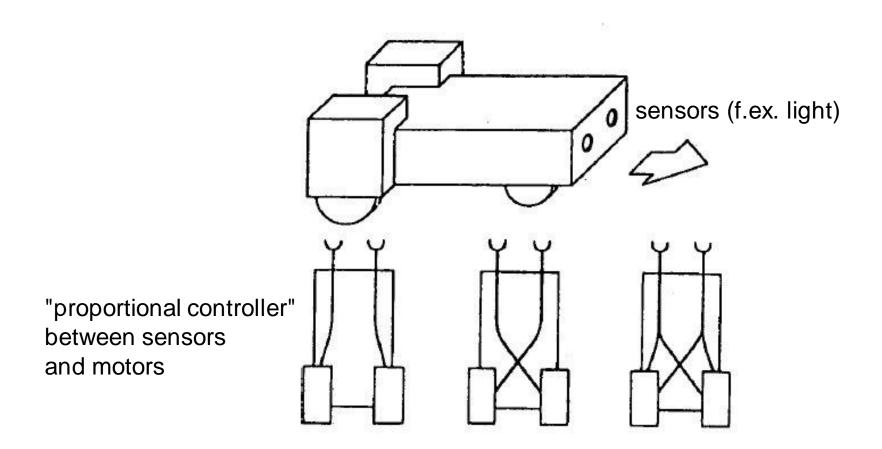
controller "logic": 
$$\mathbf{a} = \mathbf{K} * \mathbf{s} + \mathbf{c} \quad \text{, i.e.} \quad \begin{pmatrix} a_1 \\ a_2 \\ ... \\ a_m \end{pmatrix} = \begin{pmatrix} k_{11} & k_{12} ... & k_{1n} \\ k_{21} & k_{22} ... & k_{2n} \\ ... & ... & ... \\ k_{m1} & k_{m2} ... & k_{mn} \end{pmatrix} * \begin{pmatrix} s_1 \\ s_2 \\ ... \\ s_n \end{pmatrix} + \begin{pmatrix} c_1 \\ c_2 \\ ... \\ c_m \end{pmatrix}$$

i.e. 
$$a_j = k_{j1} \cdot s_1 + k_{j2} \cdot s_2 + .... + k_{jn} \cdot s_n + c_j$$
,  $j=1..m$ 

vector **s** may also represent deviations from target values of the sensors:

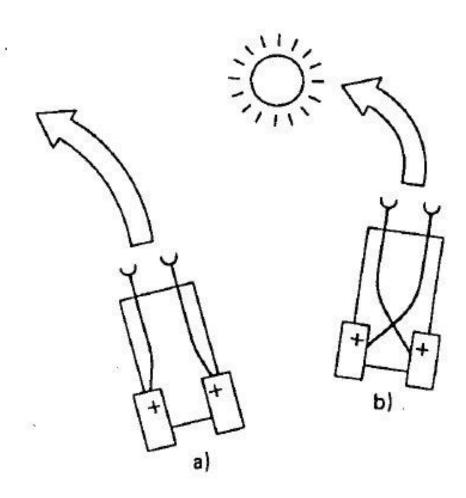
$$s - s_{target}$$
  $\Rightarrow$   $a = 0$  when target value has been reached

## Valentin Braitenberg: Vehicel - Experimente mit künstlichen Wesen Wissenschaftliche Paperbacks Band 26, LIT Verlag 2004

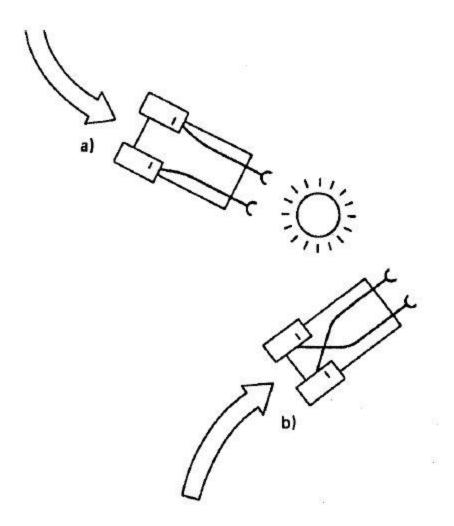


Braitenberg Vehikel: a) "fear"

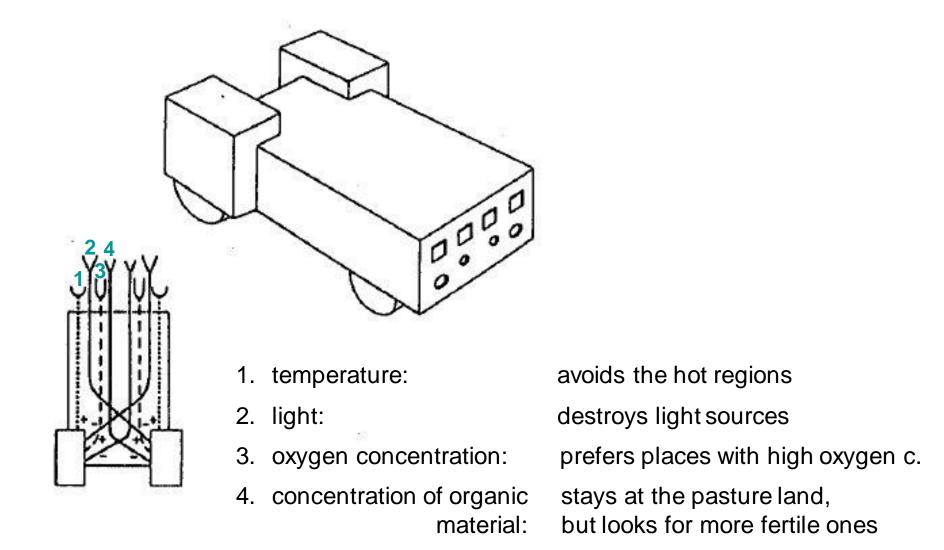
b) "aggression"



Braitenberg Vehicle: "love"



Braitenberg Vehicle: more complex, multisensorial vehicle



#### starting point:

control based on logic (rules) is intuitive

#### problems:

- bang-bang control doesn't result in smooth control
- control is not robust under sensor uncertainty

#### a solution:

- use fuzzy logic and fuzzy control

the figures of the following slides refer to http://en.wikipedia.org/wiki/Fuzzy control system

"fuzzification" of continuous values (float, conceptually) to categories (enums):

 fuzzy description of input variables (from sensors)

T = cold(0.6), cool(0.2)

 fuzzy description of control settings (to actuators)

N3: Large negative.

N2: Medium negative.

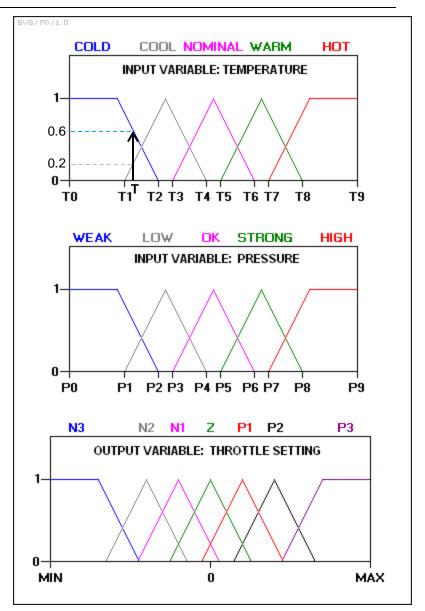
N1: Small negative.

Z: Zero.

P1: Small positive.

P2: Medium positive.

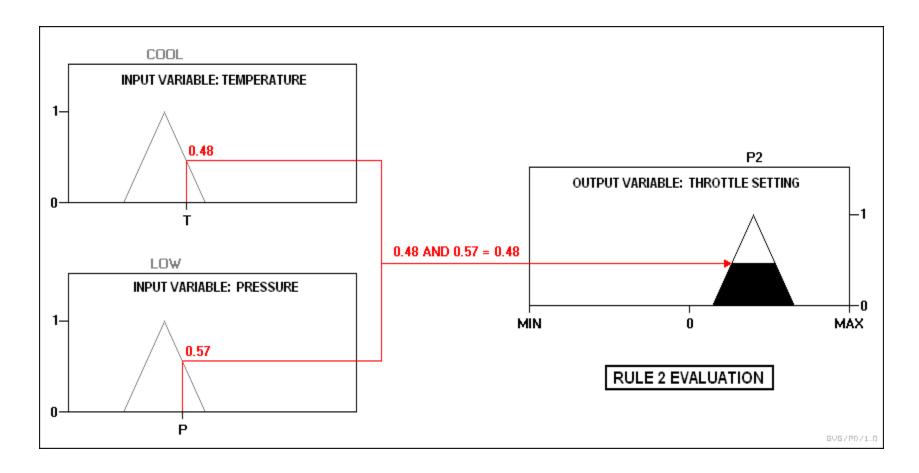
P3: Large positive.

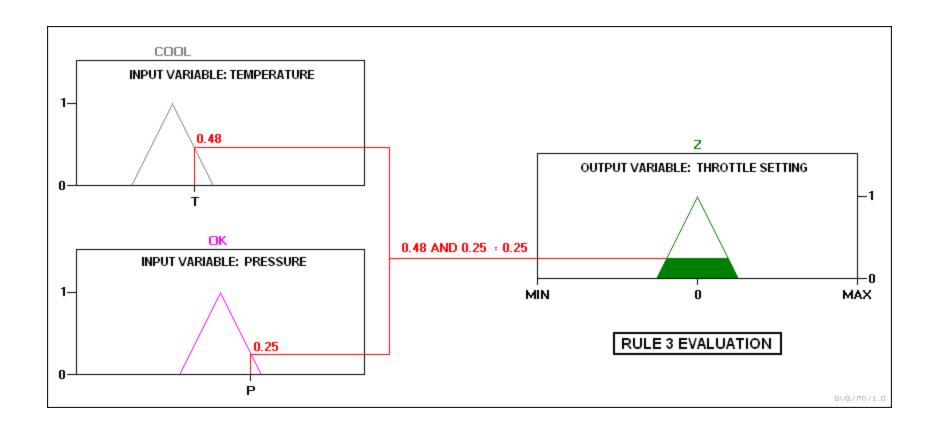


#### Controller: in bang-bang style:

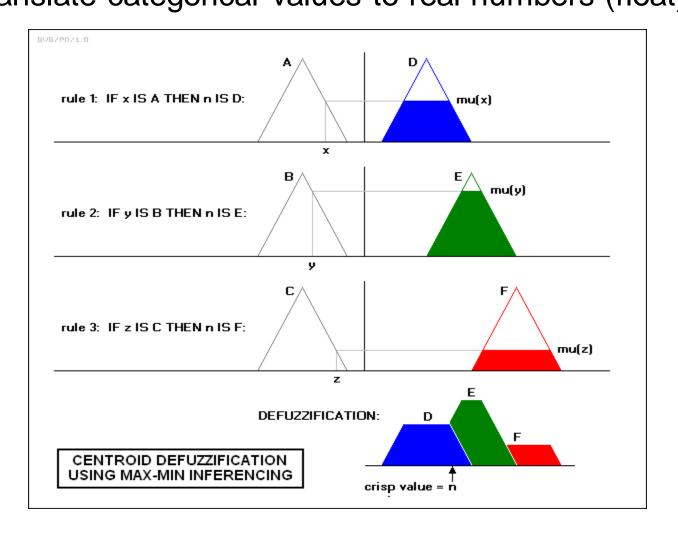
- rule 1: IF temperature IS cool AND pressure IS weak
   THEN throttle is large positive (P3)
- rule 2: IF temperature IS cool AND pressure IS low THEN throttle is medium positive (P2)
- rule 3: IF temperature IS cool AND pressure IS ok THEN throttle is zero (Z)
- rule 4: IF temperature IS cool AND pressure IS strong
   THEN throttle is medium negative (N2)

• ...





last step of a fuzzy control step: <u>defuzzification</u>
- translate categorical values to real numbers (float)



advantages of fuzzy control:

- robust under sensor value uncertainty (imprecision)
- continuous control because of defuzzification
- maintains the rule-based description: more intuitive than proportional controllers

Beispiel für das Inverted Pendulum:

http://www.doc.ic.ac.uk/~nd/surprise\_96/journal/vol4/sbaa/report.fuzrules.html

