

Artificial Intelligence

– state of affairs and perspective

Anton Kolonin

akolonin@aigents.com

Facebook: [akolonin](#)

Telegram: [akolonin](#)



<https://facebook.com/groups/agirussia>
<https://t.me/agirussia>



AI – where are we now?

Programmable



Adaptive

Guided



Autonomous

194?

2020

20??

Weak



Strong

Big Data,
Machine Learning,
Experimental Statistics



Human-level
AI (HLAI)



Super-
human
AI

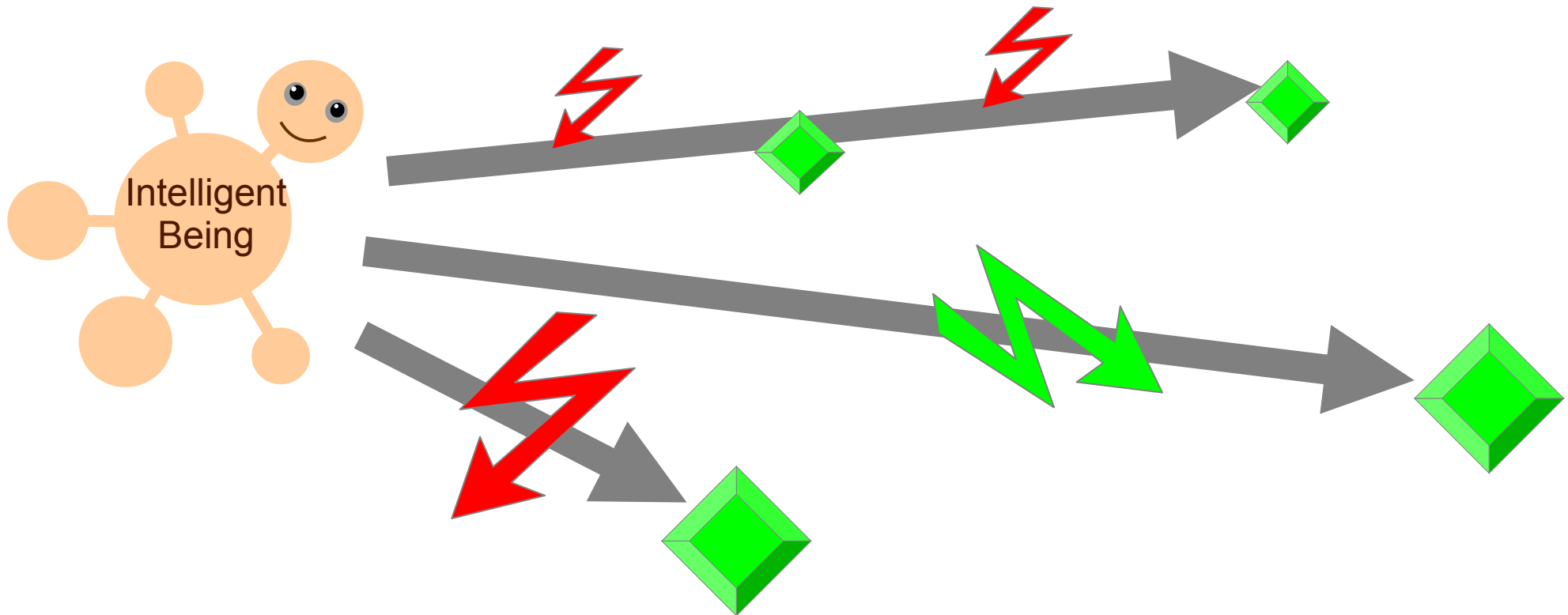
Narrow Artificial
Intelligence (AI)



Artificial General
Intelligence (AGI)

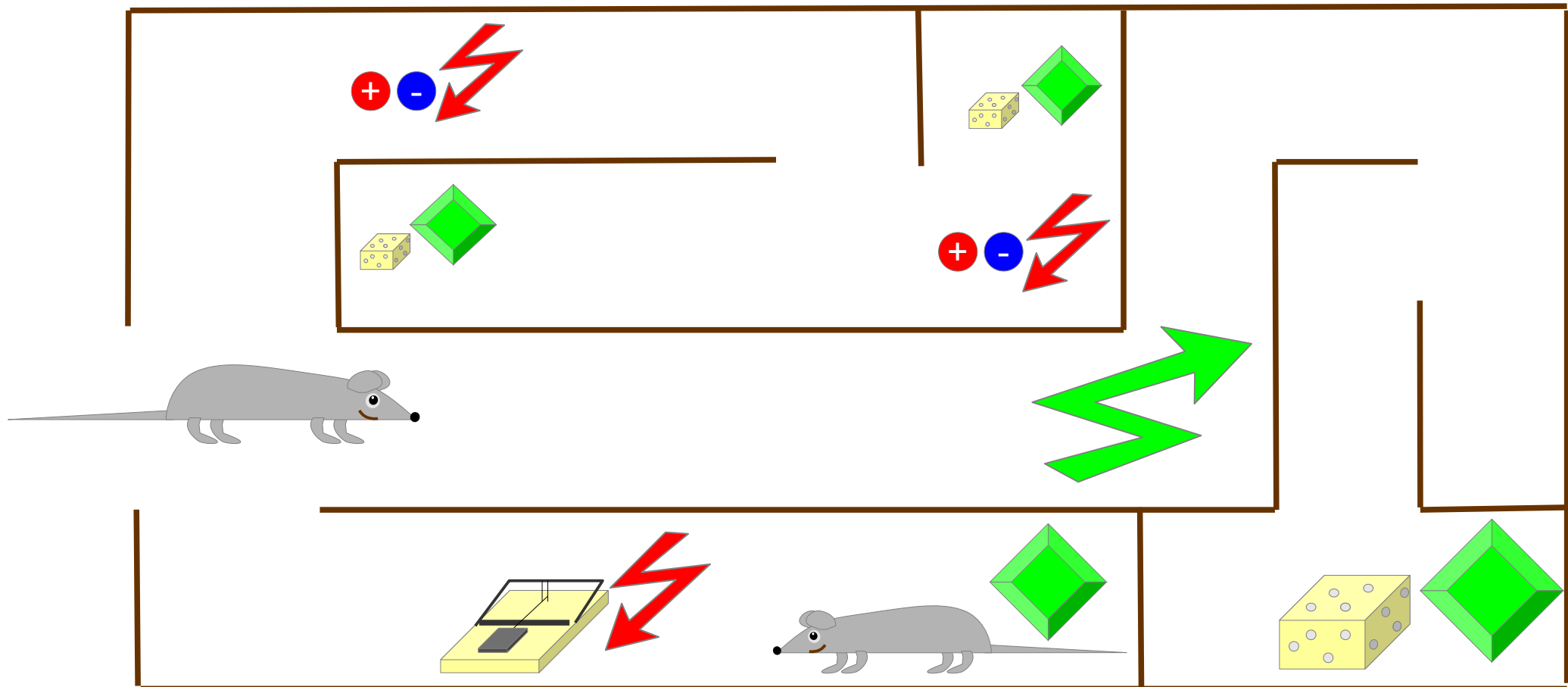
General Intelligence:

Reaching complex goals in
different complex environments, using
limited resources and minimizing risks
(Ben Goertzel + Pei Wang + Shane Legg + Marcus Hutter)



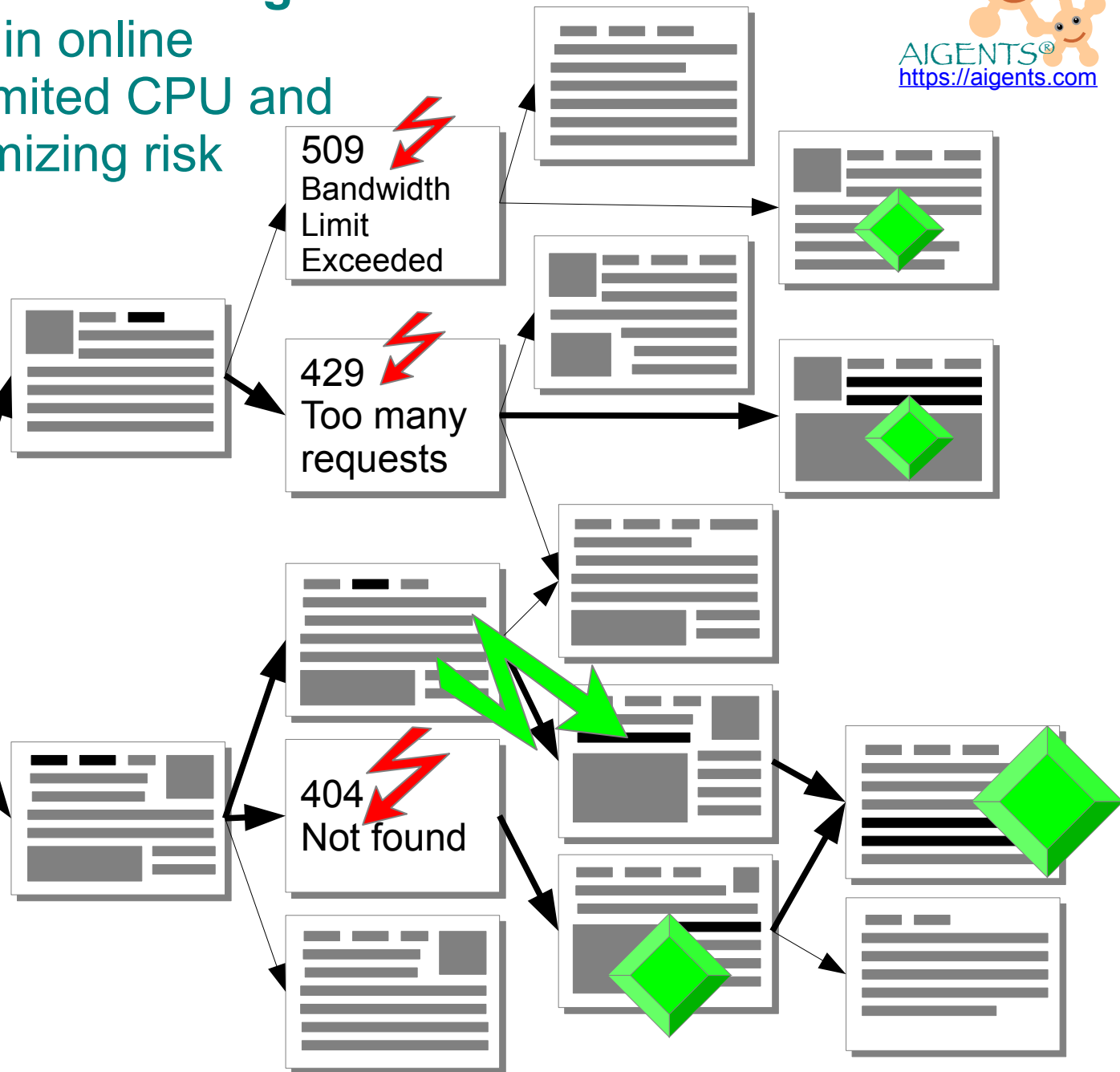
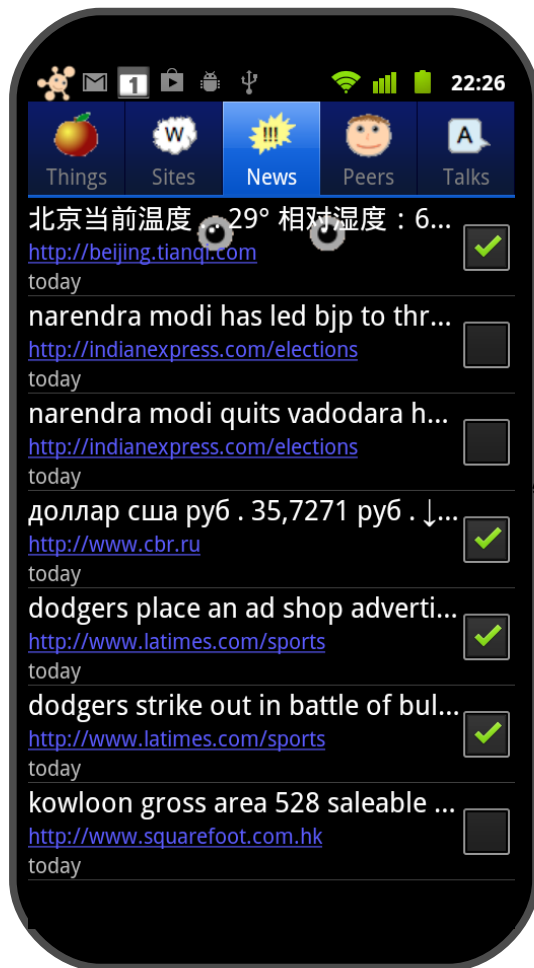
Biological Intelligence:

Reaching food and parents for self-reproduction in natural environments using limited physical resources and minimizing existential risks



Personal Internet Assistant - Aigents®

Reaching information in online environments using limited CPU and RAM resources, minimizing risk of being banned



What does come next?

- Either - new “AI winter”, or – new breakthrough towards “technological singularity”?
- AGI will appear in large companies which own really big data to train it and great capabilities to attract talents to create it?
- Expected time of AGI arrival based on expert opinions – closest: 3-5 years, median: 80 years.
- What is important for AGI:
 - Work definition, “different environments”, “risk mitigation” (complex goals and environments and minimizing consumption of resources);
 - “Definition of done” in terms of “Baby Turing Test” - including not criteria of passing the test only, but ability to learn approaching the criteria satisfaction following the “learning curve” incrementally.

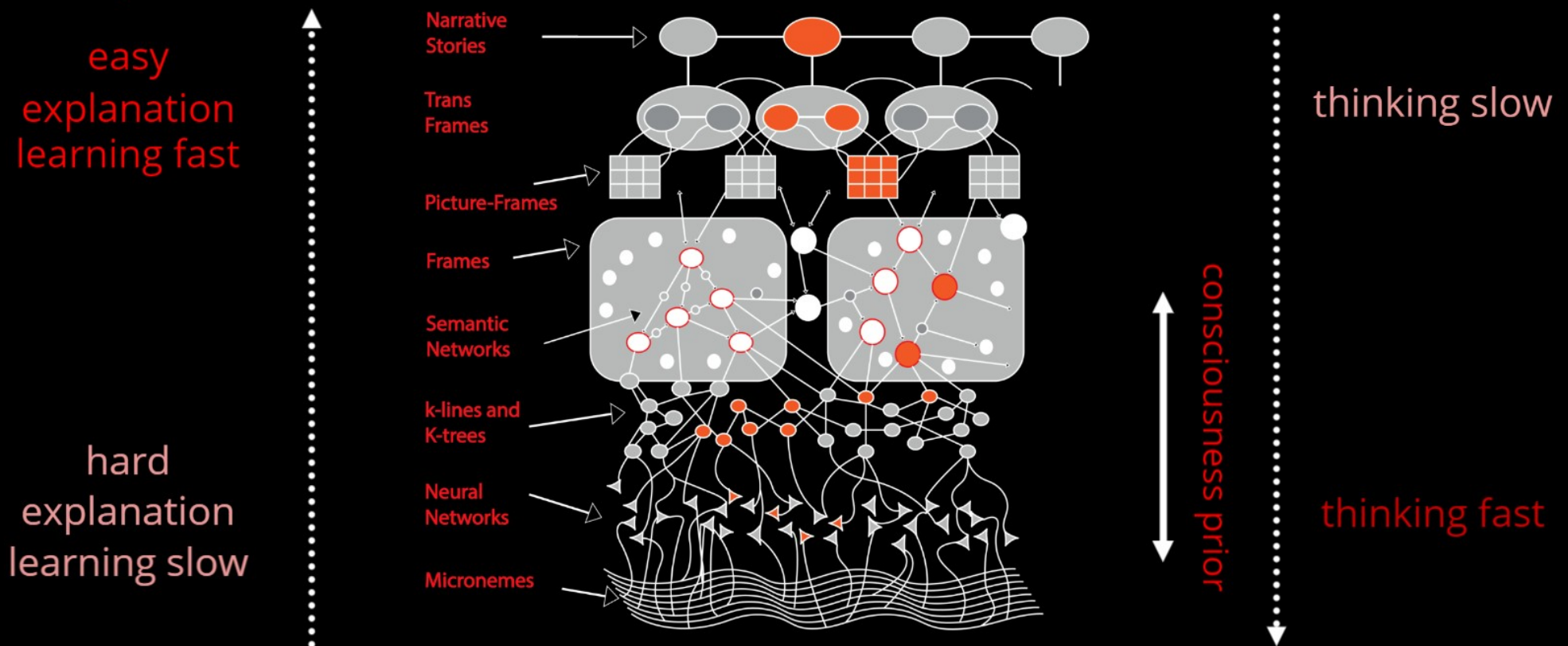
Current AI/AGI frontiers

- Neuro-Symbolic integration
- Explainable/Interpretable AI
- Transfer learning
- One shot (few-shot) learning
- Strong generalization
- Generative models
- Structured prediction and learning
- Fighting catastrophic forgetting
(and catastrophic remembering)
- Incremental learning and life-long learning
- Multi-modal learning
- New “Turing Test” (e.g., “Baby Turing Test”)
- Solving the “consciousness” problem

Hybrid Neuro-Symbolic Cognitive Architectures

Society of Mind – Marvin Minsky

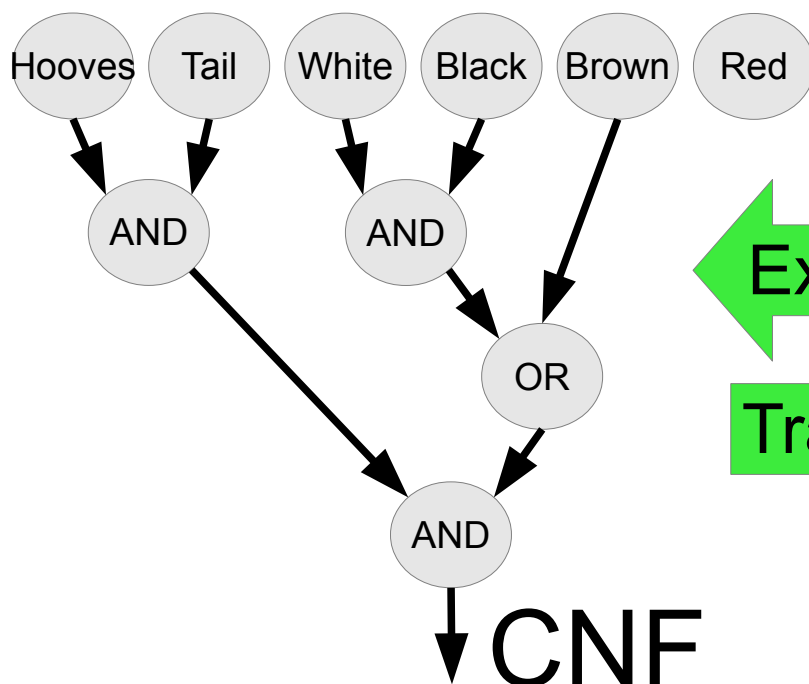
Thinking, Fast and Slow – Daniel Kahneman



<https://towardsdatascience.com/explainable-ai-vs-explaining-ai-part-1-d39ea5053347>

Bridging the Symbolic-Subsymbolic gap for “explainable AI” and “transfer learning”

Labeled graph



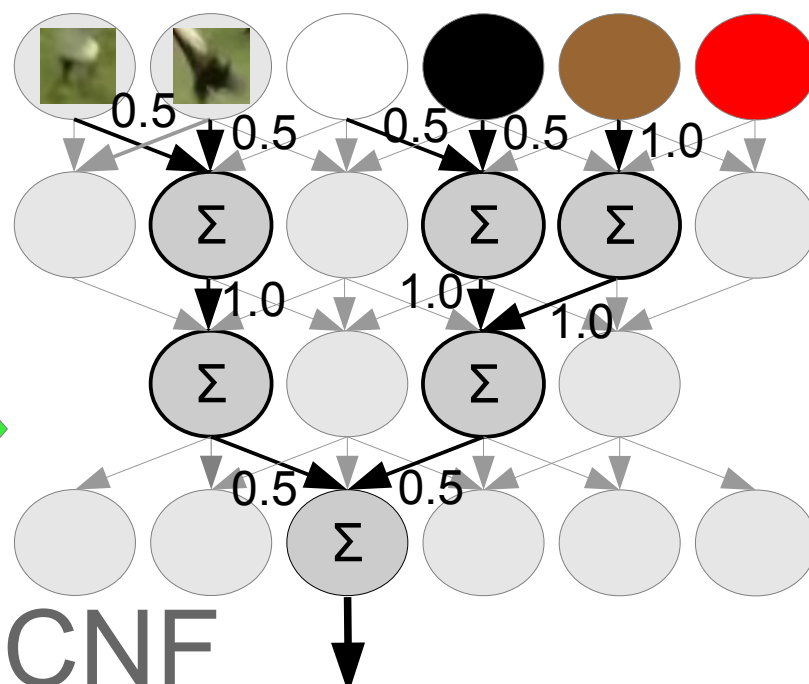
(Hooves AND Tail) AND
((White and Black) OR Brown)

=> Horse

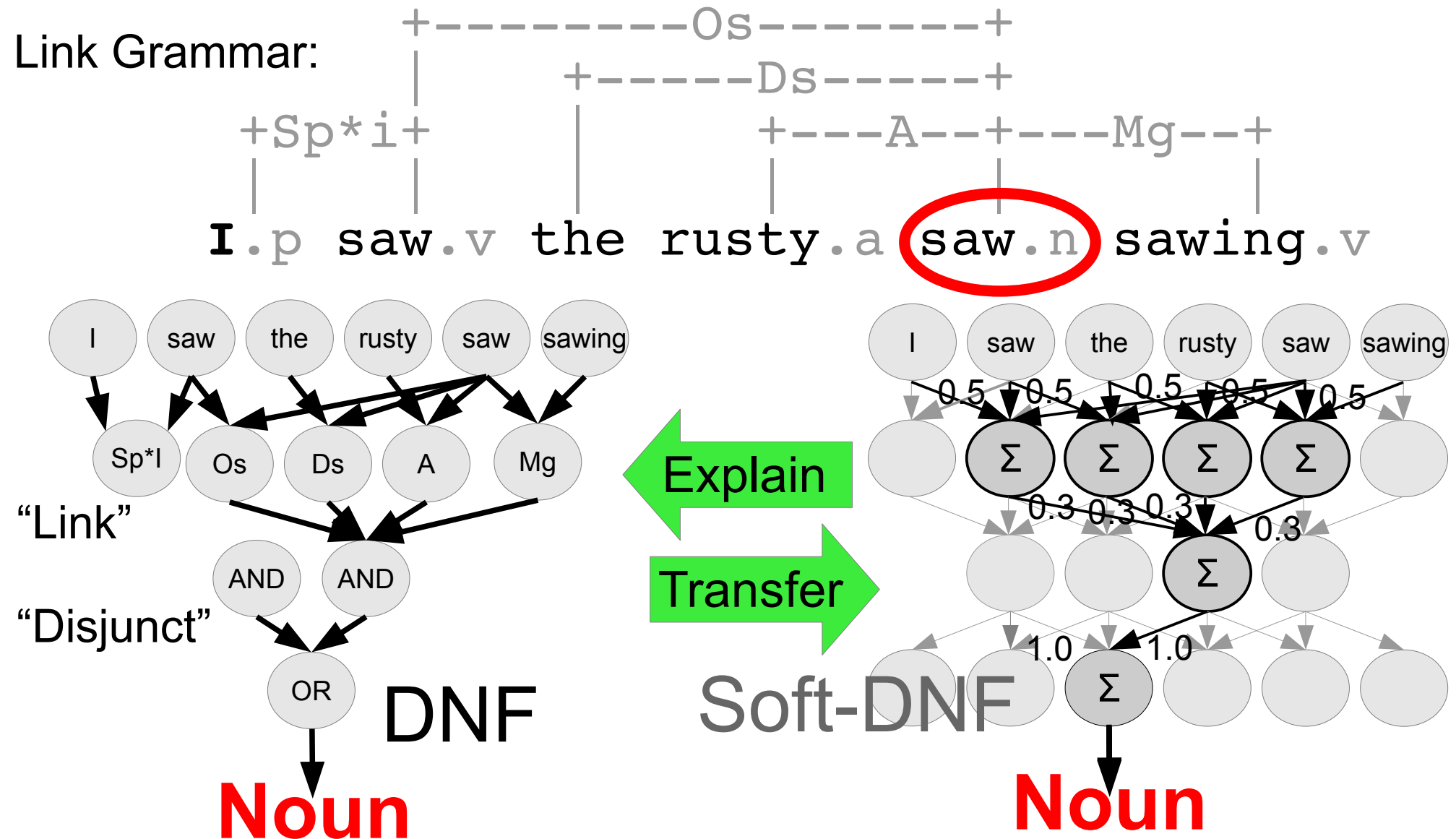
Explain

Transfer

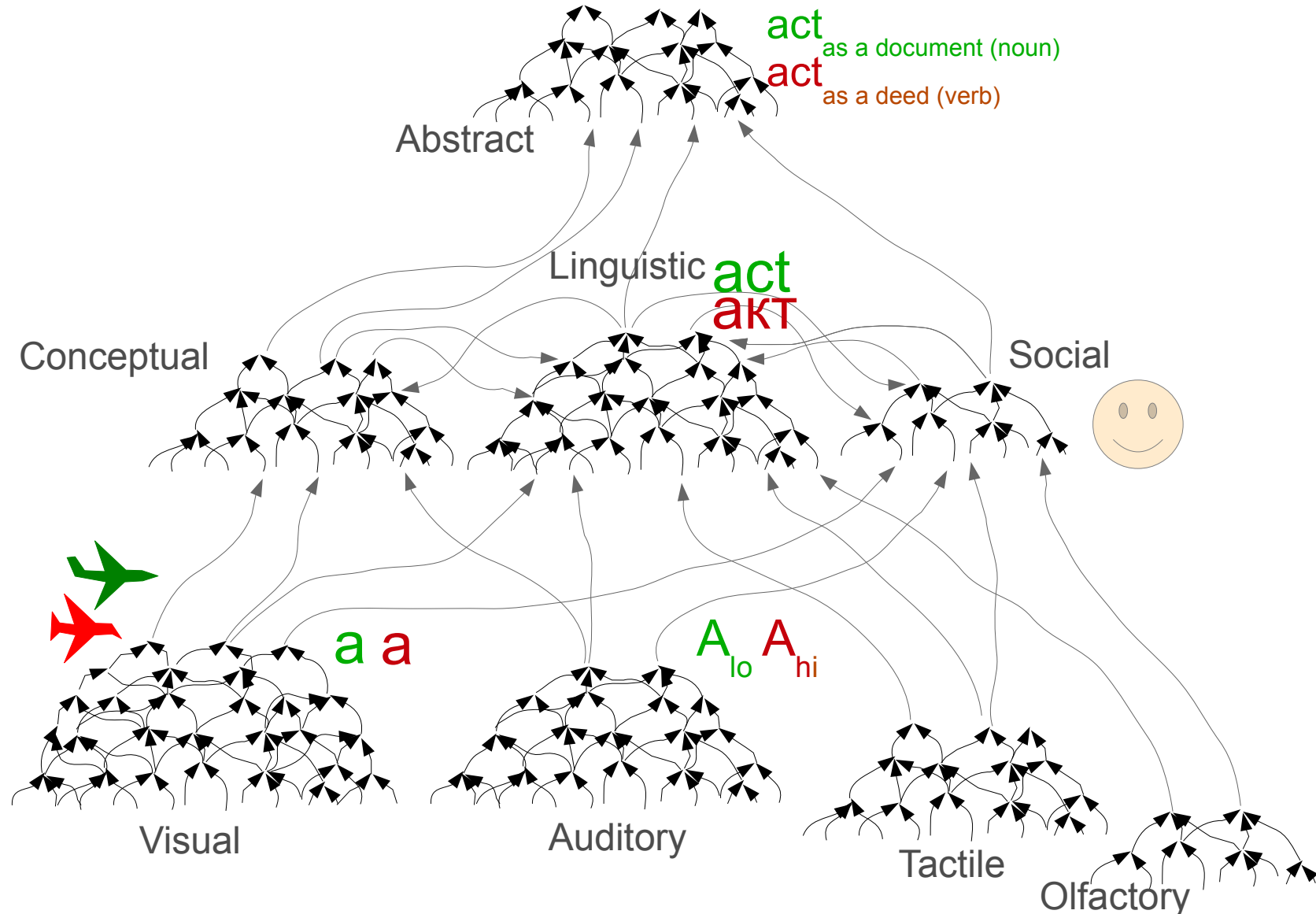
Unlabeled graph



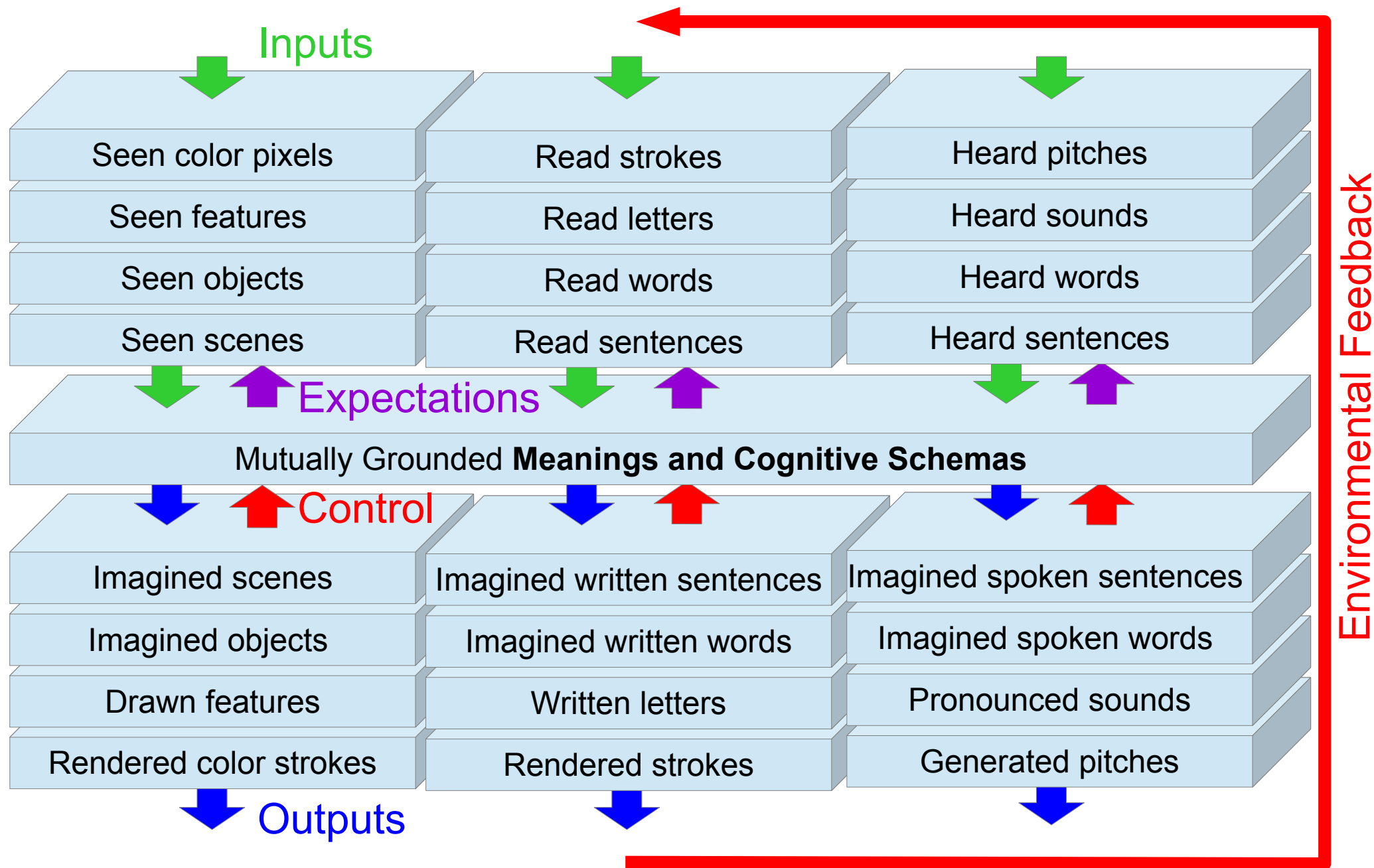
Bridging the Symbolic-Subsymbolic gap in NLP between distributed representations and formal grammars with ontologies



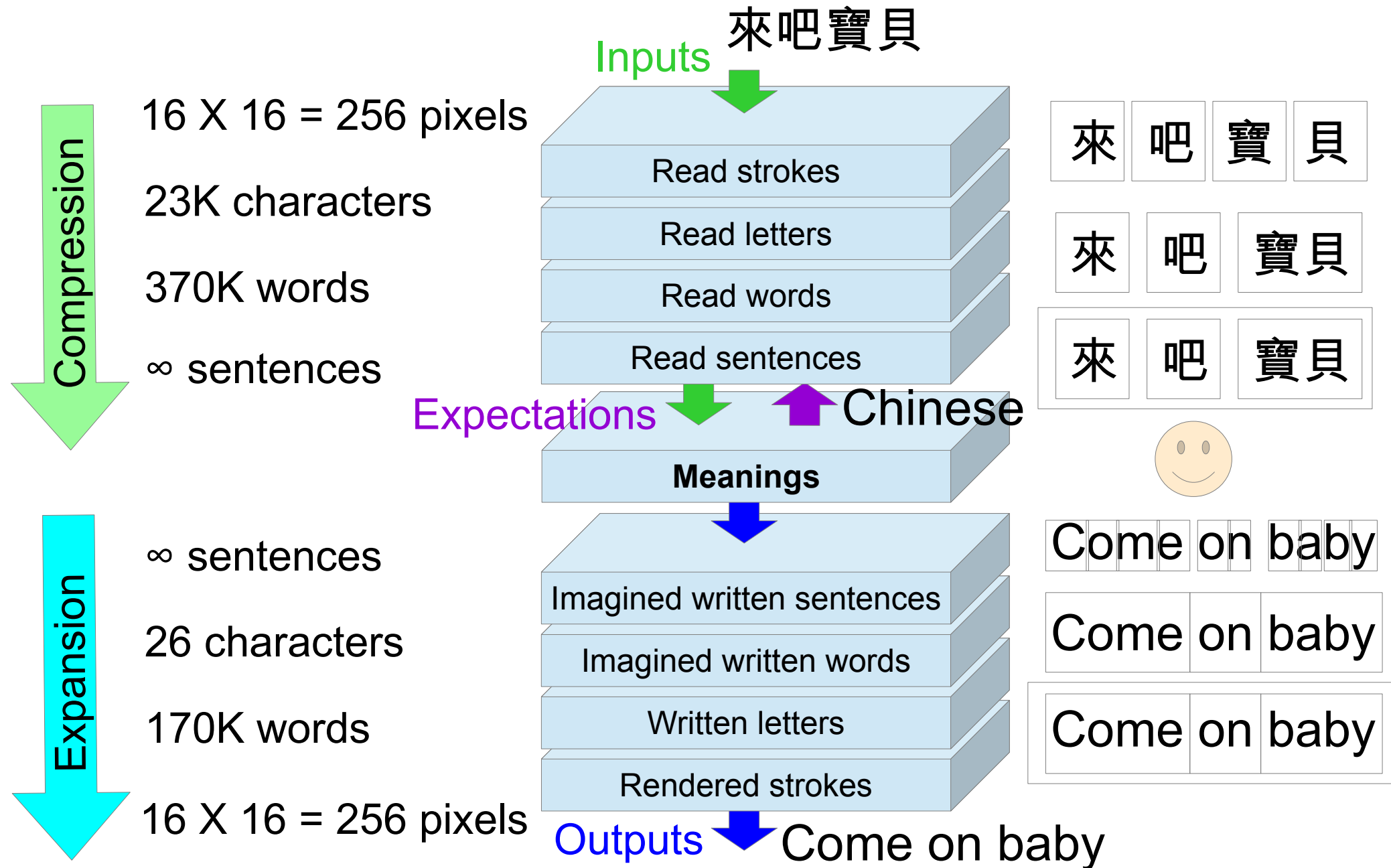
Physiological Plausibility – different segments of cortex responsible for different level of abstractions



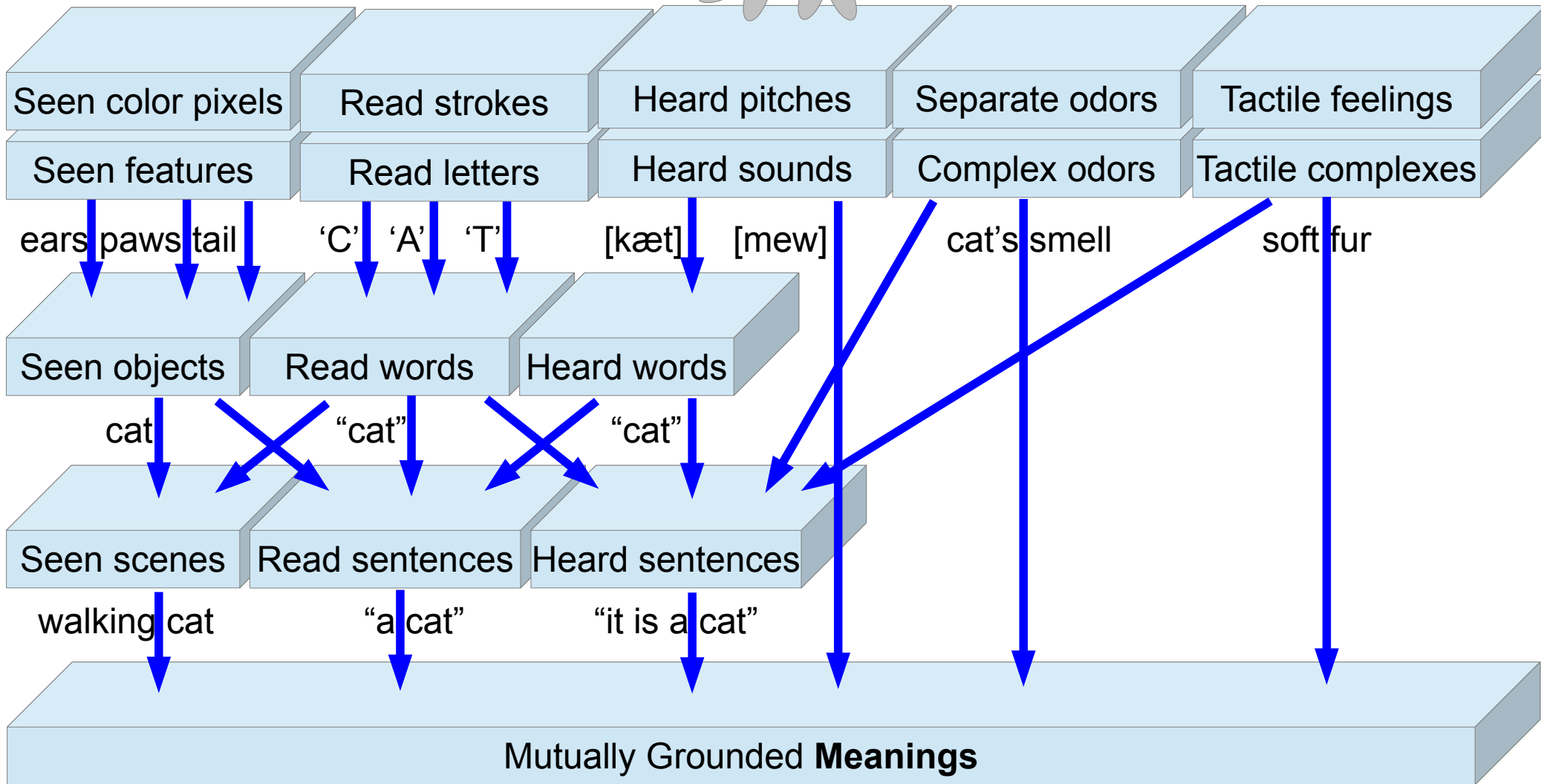
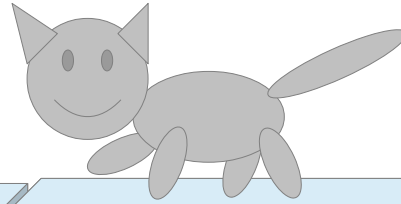
Multi-modal perception and action



Multi-layer transformation of complexity



Multi-modal perception + mutual grounding



This walking cat is mewling!

Explainable AI (XAI) vs. Interpretable AI

XAI model output explanation techniques

“Dual” systems (like DNN + CBR)

Transformation to "soft" CNF/DNF rules (softmax, arg max)

XAI LIME

XAI SHAP

Life-long & Incremental Learning

(compression/forgetting—extraction—injection—extension)

Interpretable model representations

Deep Bayes

Deep Random Forest

Soft Decision Trees

Probabilistic/Fuzzy Logic

OpenCog/PLN

NARS

“Discovery”

Formal Concept Analysis (FCA)

New (and forgotten old) approaches

Convergence

- Joining neural networks into cognitive architectures

 - Complex DNN Architectures

 - Attention-allocation networks

 - Contextual question answering and sentiment analysis

 - 3D CNN for spatiotemporal predictions

- Hybridization of neural networks with probabilistic programming

- Integration of neural networks with semantic networks (“knowledge graphs”)

AGI

- Narrow AGI (Ben Goertzel, SingularityNET)

- Probabilistic programming

 - It is in the state of “neural networks” 20 years ago and may turn revolutionary in just few years (Alexey Potapov, SingularityNET)

- Agent Models

 - AIXI – universal compressor and predictor (Marcus Hutter, Arthur Franz)

 - Anokhin’s Theory of Functional Systems (TFS) extension (Evgenii Vityaev)

 - Reinforcement Learning based on “fluents” (state variables or atoms representing the states)

- Ecosystem approach

 - No one knows how to make AGI (so “let all colors bloom”)

 - Brain on itself is not the same (different brain regions have totally different “architectures”)

New (and forgotten old) approaches

Deep Learning for AGI

Demis Hassabis: "transfer learning is a key ... to general intelligence"

Yan Lecun: "learn models of the world"

Cognitive Pyramid:

- Casuality

- Reinforcement-learning

- Transfer-learning

- Meta-learning (Learning to Learn)

- DL

- GANs

- ML

- ...

World<->ControlNetwork<->ModelNetwork (*"Learn how to Learn"*)

A lot to study, still

Dendrites/synapses branching

Holobionts - synergetically interacting societies

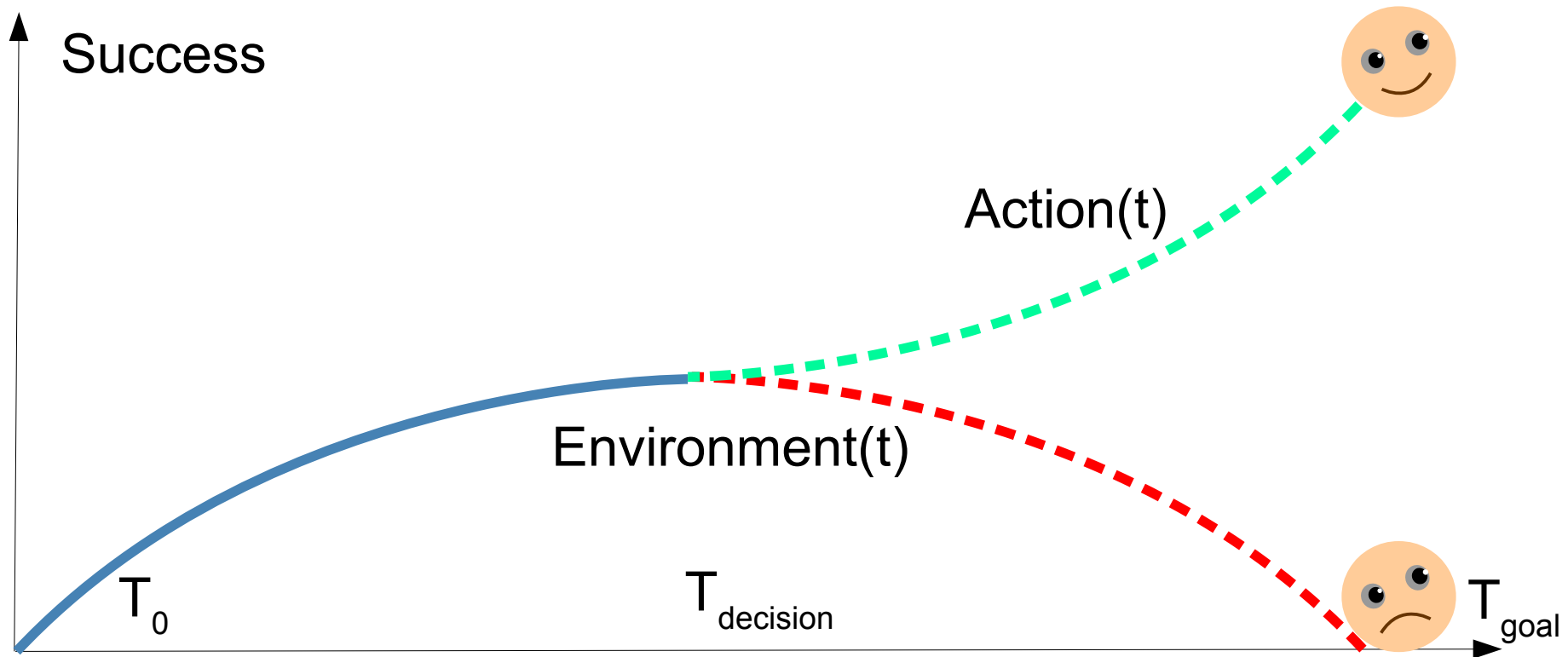
(matching studies by Jeff Hawkins,

who suggested the HTMs, preceding the DNNs)

Neuron Microtubules

Consciousness:

Ability to build models of the environment based on the past to predict the future scenarios and act “consciously” towards the desired ones



Acting consciously:

Agent being able to direct the sequence of behavioral acts (at least) to itself by any (internal or external) **language** (ontology/lexicon/grammar)



Push legs,
pull right hand

```
push(right_leg);  
push(left_leg);  
pull(right_hand).
```



Push left leg,
pull both hands

```
push(left_leg);  
pull(right_hand);  
pull(left_hand).
```



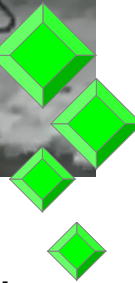
Pull left hand,
look right.

```
look(right);  
pull(left_hand).
```



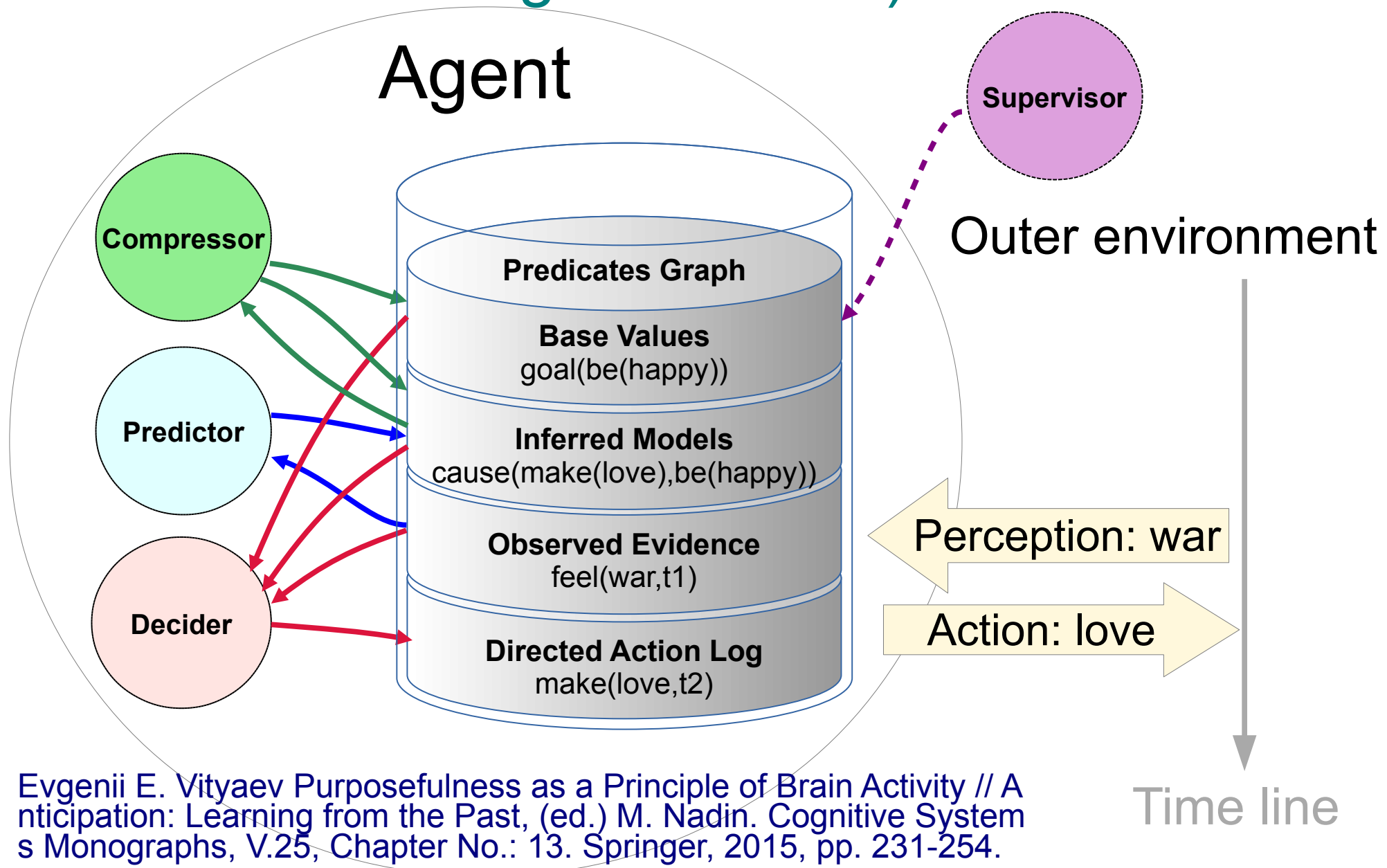
Pull right hand,
bend both legs.

```
pull(right_hand);  
bend(right_leg);  
bend(left_leg).
```



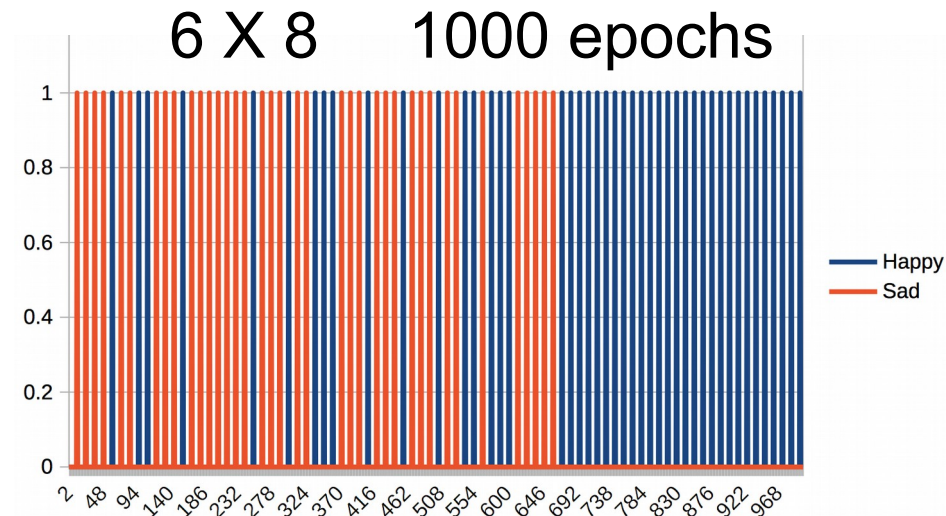
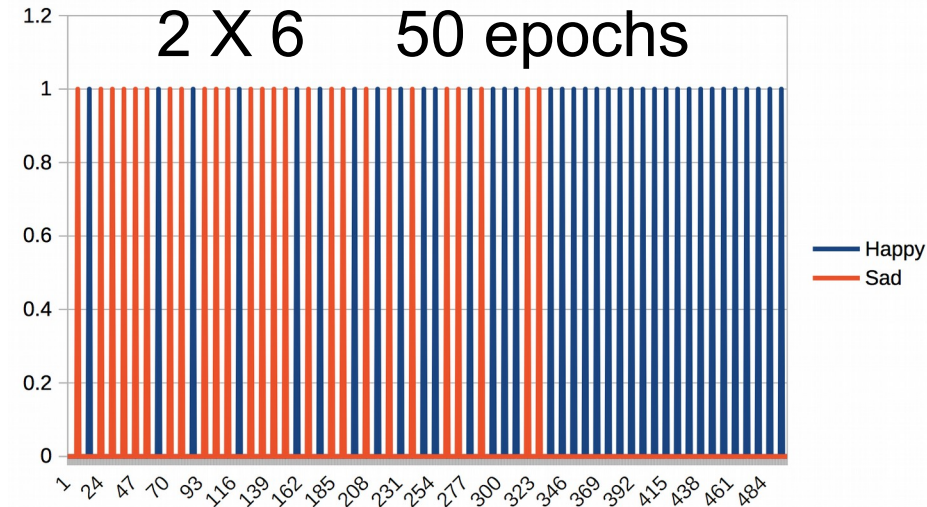
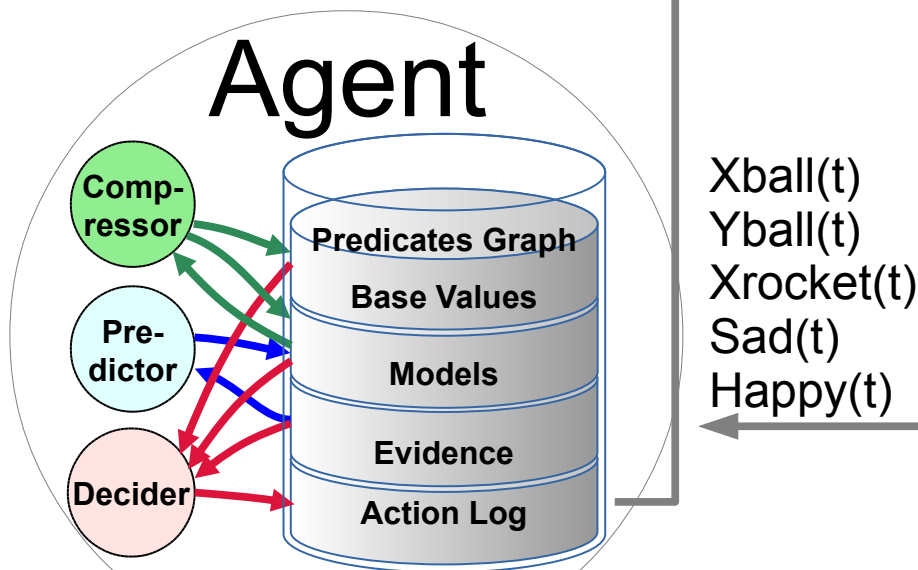
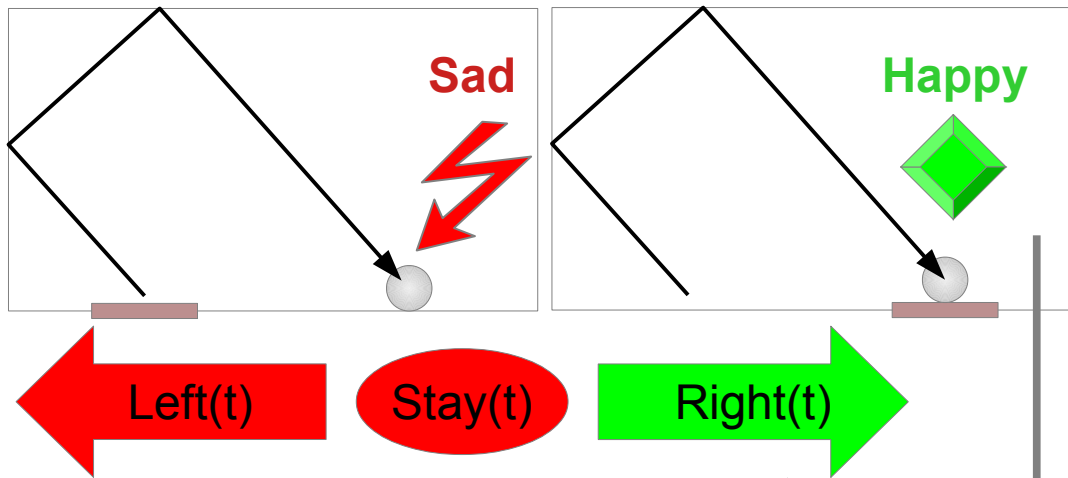
<https://www.youtube.com/watch?v=oYWjqTP0AKM>

AGI Agent Cognitive Architecture (and AGI-unit testing framework) based on TFS



AGI Agent Cognitive Architecture

learning simplified “Atari Breakdown” game



<https://arxiv.org/abs/1807.02072>

<https://github.com/aigents/aigents-java/blob/master/src/main/java/net/webstructor/util/AgiTester.java>

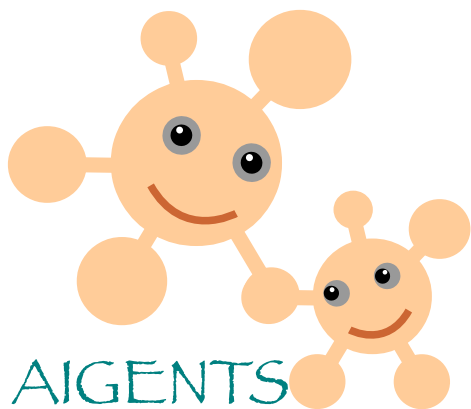
Thank you and welcome!

Anton Kolonin

akolonin@aigents.com

Facebook: [akolonin](#)

Telegram: [akolonin](#)



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