# A Bayesian Hierarchy as a Model of Human Active Visuoauditory Perception

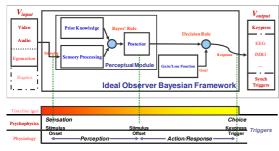
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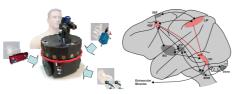
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# CogSys2010

## Abstract

 We will present an experimental paradigm and protocol to develop a Bayesian hierarchical framework that models human visuoauditory-driven saccade generation.





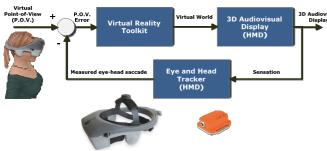
#### Goals

- Bayesian models for perception
   fusion/multimodality
  - ambiguity
  - conflicts
- · Biologically inspired
- Applicable to artificial systems
- Unified research framework

#### Background

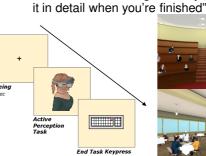
- Humans and other animals do not look at a scene in a steady way.
- Sensors are directed to
  -unknown parts of the scene
  -interesting parts of the scene
- This way redundant evidence can be accumulated about a scene (i.e. active perception):
  - -lowering uncertainty of individual sensor measurements
  - using limited-scope sensorial resources more efficiently

## **Experimental Setup**



## **Experimental Protocol**

• Generic Exploration Task: –"Look at the following scene; you must be able to describe





ion Based on Entropy (

 NVIS HMDs with Arrington eye-trackers and xsens MTi Attitude and Heading Reference System head-tracker

## **Bayesian Hierarchical Framework**

- Constant Model (π<sub>A</sub>):
  - model directly reflecting fixation points data from training set, without using representation model
- Active Exploration Based on Entropy (π<sub>B</sub>)
  - model that includes  $\pi_A$  and representation model (the Bayesian Volumetric Map or BVM see [1]), adding an active exploration behaviour based on the uncertainty of the representation model states
- Automatic Orienting Based on Sensory Saliency (π<sub>C</sub>)
  - model that includes  $\pi_A + \pi_B$ , adding an automatic orienting behaviour based on sensory saliency taken from BVM sensor model operator extensions

 $\pi$ )

# Discussion

• Performances of models  $\pi_B$  and  $\pi_C$  are compared to the constant model  $\pi_A$  using the ratio of the geometric mean over all trials of the likelihoods of each model [2]:

$$\mu_{\mathrm{geom}}(\pi) = \sqrt[N]{\prod_{n=1}^N \prod_{t=1}^{t_{\mathrm{max}}} P([G_t = g_n^{t+1}]|v^{1 \rightarrow t} \, o^{1 \rightarrow t})}$$

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- Robotic simulations have already shown the potential of the hierarchical framework developed in this work.
- Psychophysical experiments are currently being conducted with just under 20 subjects with "normal-to-corrected perception" in order to validate hypothesis and train the models – preliminary results are very promising in this respect.

Active Explo

Automatic Orienting Based on Sensory S

• Future experiments with autistic patients are already being planned.

#### Selected Biliography

- [1] J. F. Ferreira, et al., "Bayesian Models for Multimodal Perception of 3D Structure and Motion," in International Conference on Cognitive Systems (CogSys 2008), University of Karlsruhe, Karlsruhe, Germany, April 2008, pp. 103–108.
- [2] F. Colas, F. Flacher, T. Tanner, P. Bessière, and B. Girard, "Bayesian models of eye movement selection with retinotopic maps," Biological Cybernetics, vol. 100, pp. 203–214, 2009.

# Mobile Robotics Laboratory

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