# HTC and Cognitive Neuroscience OSG User School Spotlight

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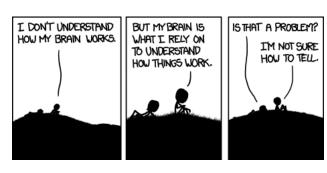


Figure: xkcd 1163

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- This perspective makes relating mental representations to neural representations computationally intensive.



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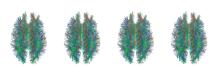
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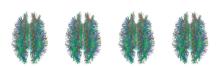
Neural Representations Physical states of the brain that implement mental representations.

Distributed representation A pattern of neural activity composed of units with varying response profiles. The units may not be well localized in the brain. The same units may encode many representations by activating in different patterns.

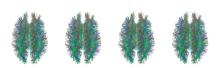
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- ▶ A full snapshot is collected every two seconds.
- Each snapshot consists of tens of thousands of voxels that fall within the skull.
- ► The challenge is to identify a set of voxels that, when taken together, can be used to discriminate between different mental representations.



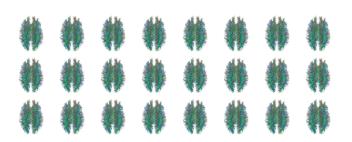






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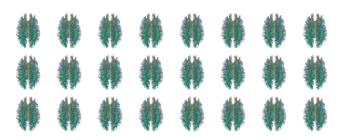
► We began with hypotheses about how the brain might actually work, and designed new algorithms that reflected those hypotheses.¹



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## ... so, why use HTC?

- ▶ We began with hypotheses about how the brain might actually work, and designed new algorithms that reflected those hypotheses.<sup>1</sup>
- (But they are much more computationally intensive.)



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- Modest cross-validated parameter sweeps can have 10,000 jobs, amounting to roughly a year's worth of processing.
- Experimenting with these algorithms would be impossible without HTC.

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Job and DAG setup can be **automated** in a way that is **easy to maintain** and **intuitive to work with** using file templating.

## Perl and Text::Template

## Requirements

- 1. Basic working knowledge of Perl. (I'm proof that you don't need to know much.)
- 2. Getting comfortable with JSON and/or YAML.
- 3. The Text::Template module for Perl.

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(This is the same way some dynamic web pages are constructed.)

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- ► I do not have petabytes of data to process and explore (but that does not mean HTCondor is overkill—quite the contrary).
- HTC has rapidly become essential to my work.
- It is possible to do a great deal without extensive prior knowledge.

## Thank you

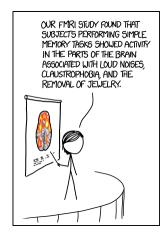


Figure: xkcd 1453