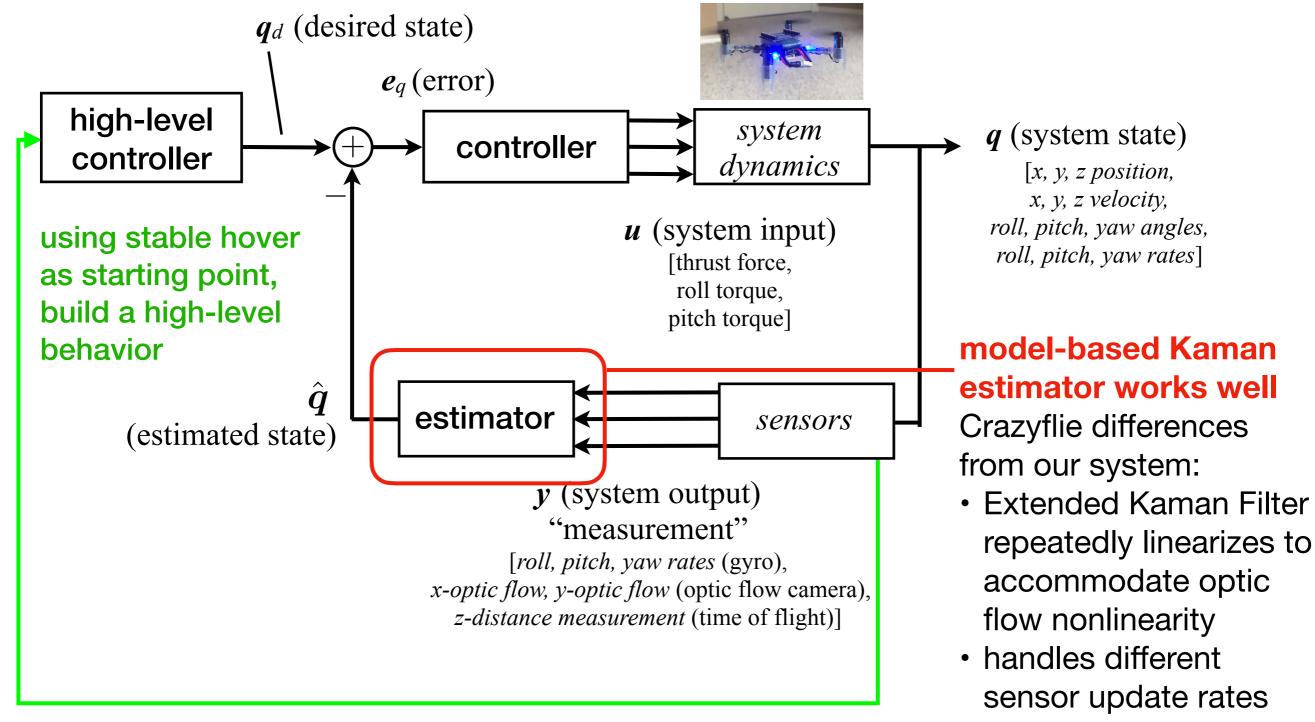
### Overview so far

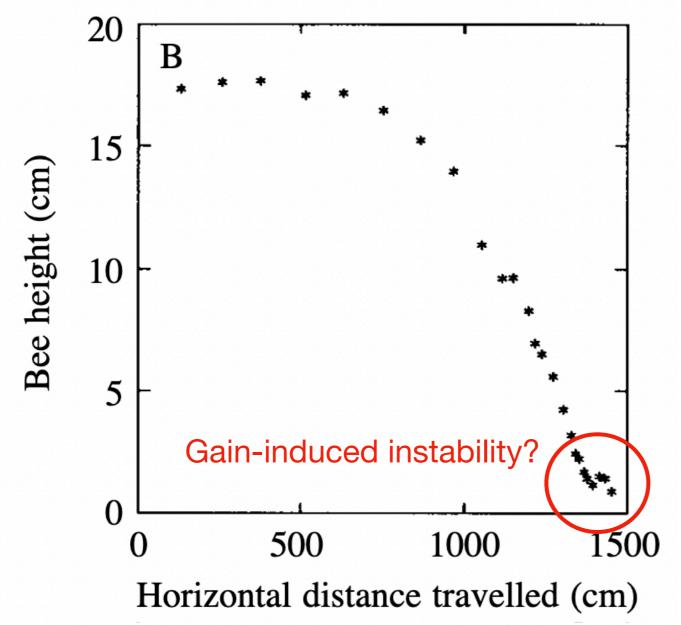


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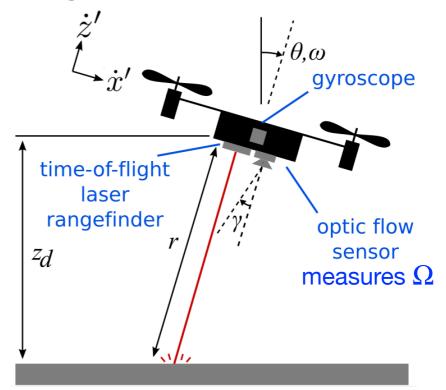
Full 3D instead of 2D

## Problem Set 5

Inspired by Decroon2016\*, which was inspired by observation of honeybee landing in Srinivasan96\*



Nice example of robotics: not just dynamics, not just vision, but the *confluence of both* 



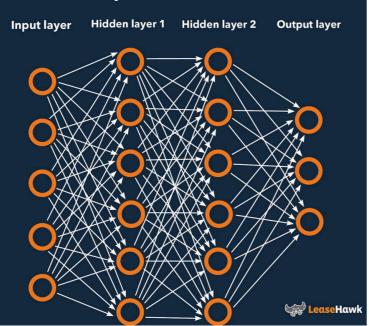
Translation-induced optic flow increases as altitude decreases:  $\dot{r}'$ 

 $\Omega_T = - - \frac{r}{r}$ Feedback law demo:  $v_{xd} = K\Omega_T$ 

\*available on course webpage

#### Paper 4 intro. First, a history of neural nets

LeCun, Y., et al. (1989). Backpropagation applied to handwritten zip code recognition. Neural - 2000 computation, 1(4), 541-551. citations  $\mathbf{O}$ 2008 2009 2010 2011 2012 2013 2014 2015 2016 2017 2018 2019 2020 2021 2022 Your instructor took a course  $?\dot{?}?$ on neural networks. Krizhevsky, A., Sutskever, I. & Hinton, G. Why would anybody do that? ImageNet classification with deep **Deep Neural Network** 



convolutional neural networks. NIPS 25 1090-1098 (2012).

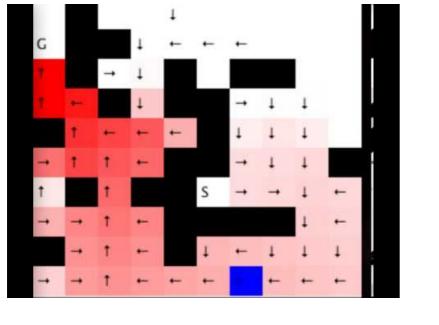


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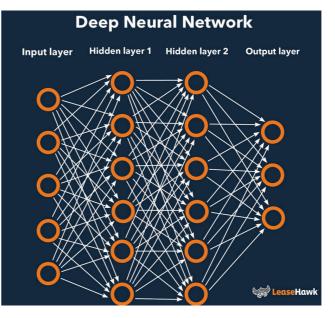
# Paper 4 intro

## Human-level control through deep reinforcement learning

Volodymyr Mnih<sup>1</sup>\*, Koray Kavukcuoglu<sup>1</sup>\*, David Silver<sup>1</sup>\*, Andrei A. Rusu<sup>1</sup>, Joel Veness<sup>1</sup>, Marc G. Bellemare<sup>1</sup>, Alex Graves<sup>1</sup>, Martin Riedmiller<sup>1</sup>, Andreas K. Fidjeland<sup>1</sup>, Georg Ostrovski<sup>1</sup>, Stig Petersen<sup>1</sup>, Charles Beattie<sup>1</sup>, Amir Sadik<sup>1</sup>, Ioannis Antonoglou<sup>1</sup>, Helen King<sup>1</sup>, Dharshan Kumaran<sup>1</sup>, Daan Wierstra<sup>1</sup>, Shane Legg<sup>1</sup> & Demis Hassabis<sup>1</sup>



State space s: which cell Action space a: which arrow direction Learned "Q function" encodes best path



A deep network approximates "Q function"

Paper 4 is about invention of "Deep reinforcement learning" to play 70's games. s is state of pixels on the screen, *a* is joystick action, reward comes from the score **VINIVERSITY** of **WASHINGTON** 4

