

How to throw accurately

Madhusudhan Venkadesan and L. Mahadevan

School of Engineering & Applied Sciences, Harvard University, Cambridge, MA, USA



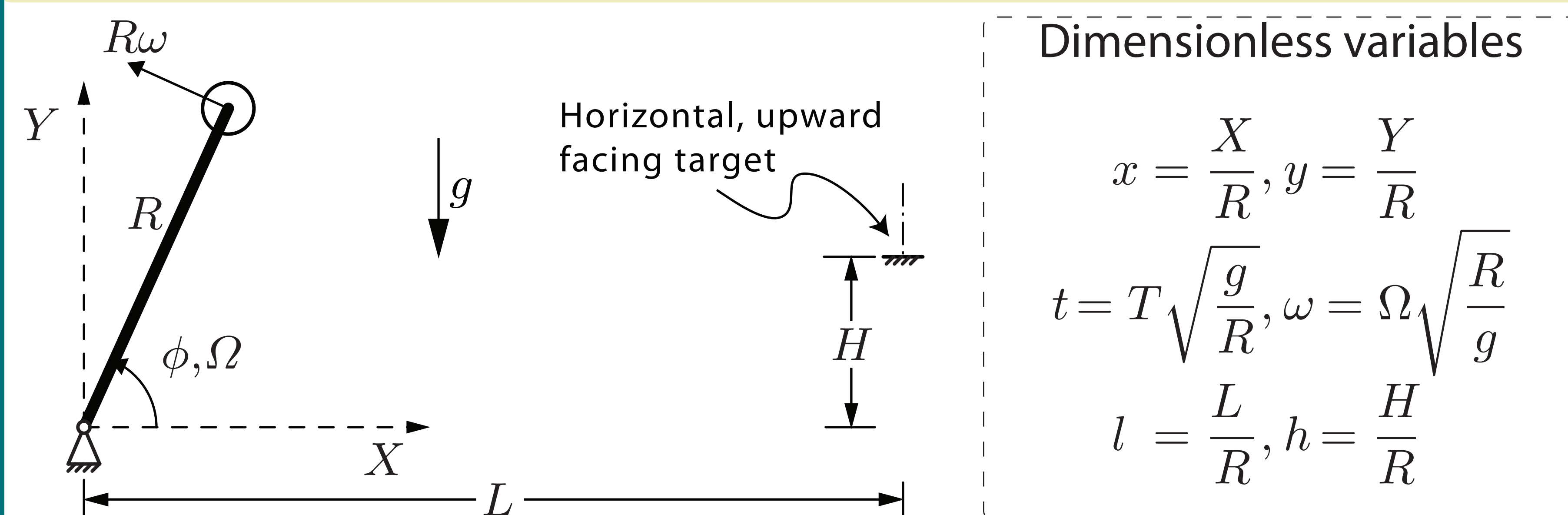
INTRODUCTION

How do the dynamics of projectile flight affect our choice between an overarm and underarm strategy?

- Throwing accuracy is important for:
 1. Motor development in children [1].
 2. Clinical evaluation of motor impairment [1].
 3. Hunting and human evolution [2].
 4. Sports performance [3].
- Launch angle and velocity of the projectile have to be carefully coordinated as errors in them are propagated by the dynamics of projectile flight.

MODEL OF THE ARM AS A HINGED BAR

'Super-human' arm with complete and independent control over the arm's release angle (ϕ) and angular velocity (Ω).



- Equations of motion:

$$\ddot{x}(t) = 0, \dot{x}(0) = -\omega \sin \phi, x(0) = \cos \phi$$

$$\ddot{y}(t) = -1, \dot{y}(0) = \omega \cos \phi, y(0) = \sin \phi$$

LINEARIZED THROWING INACCURACY

There is a one-dimensional curve of release parameters ($\phi, \omega(\phi)$) for an accurate strike, and otherwise misses the target.

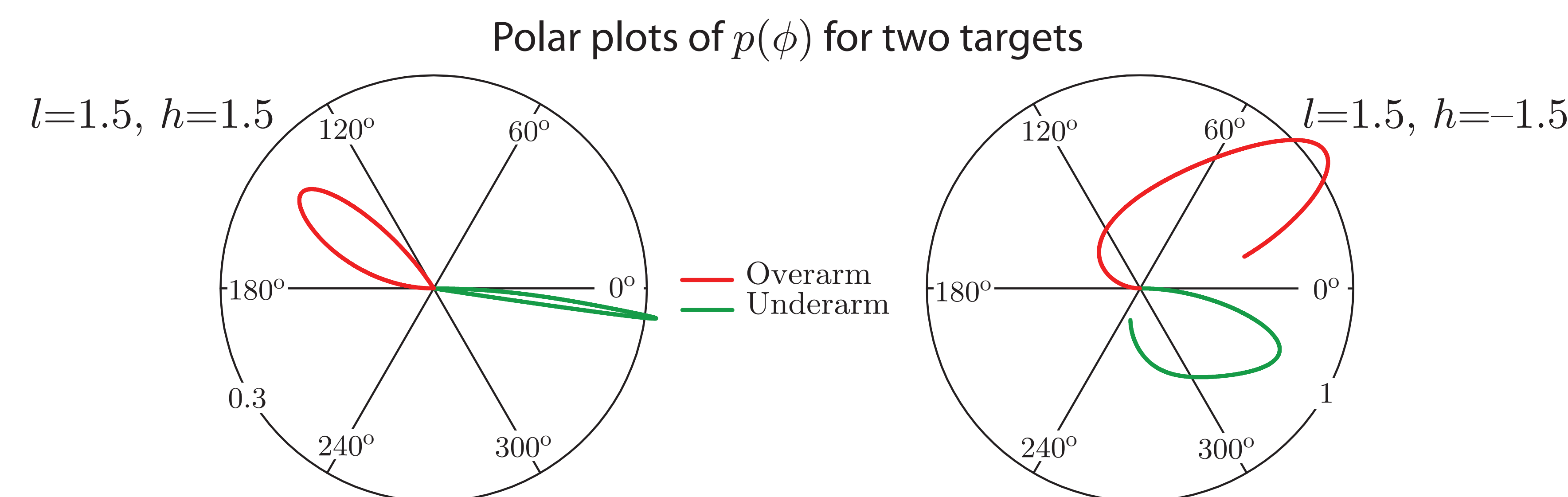
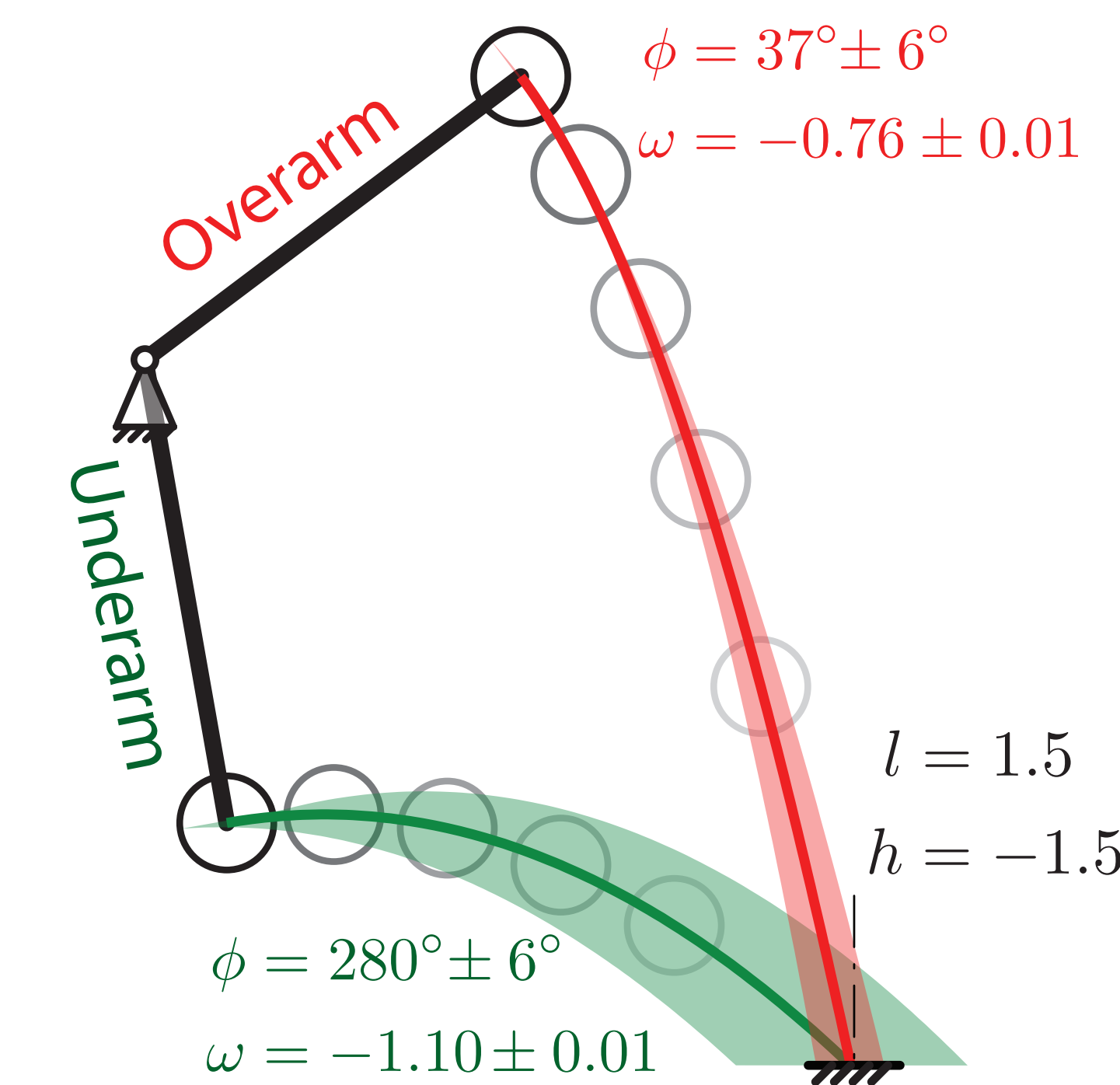
- Linearized map of input errors ($\delta\phi, \delta\omega$) to targeting error (δx_h).

$$\delta x_h(\phi, \omega) \approx J_{\text{err}}(\phi_0) \begin{pmatrix} \delta\phi \\ \delta\omega \end{pmatrix}, J_{\text{err}}(\phi_0) = \left(\frac{\partial x_h}{\partial \phi} \frac{\partial x_h}{\partial \omega} \right) \bigg|_{\phi=\phi_0, \omega=\omega_0(\phi_0)}$$

QUANTIFYING ERROR AMPLIFICATION

Error amplification is quantified by the **singular value** $\sigma(\phi)$ of the Jacobian $J_{\text{err}}(\phi)$ as a function of arm angle ϕ at release.

- Different throwing strategies amplify errors in release parameters differently.
- We grade strategies using the reciprocal of the singular value, $p(\phi) = 1/\sigma(\phi)$.
- $p_o(\phi)$ and $p_u(\phi)$ are restrictions of $p(\phi)$ to overarm and underarm regimes.



- Underarm has a higher but narrower peak, i.e. it is more resilient to small noise, but less robust to large noise than overarm.
- Overarm is more resilient to both small and large input noise than underarm.
- The expected value of $p(\phi)$ for infinitesimal input noise is given by the peak of the distribution.
- The expected value of $p(\phi)$ for large input noise is given by the area of the distribution.

EXPECTED FRACTION OF OVERARM THROWS

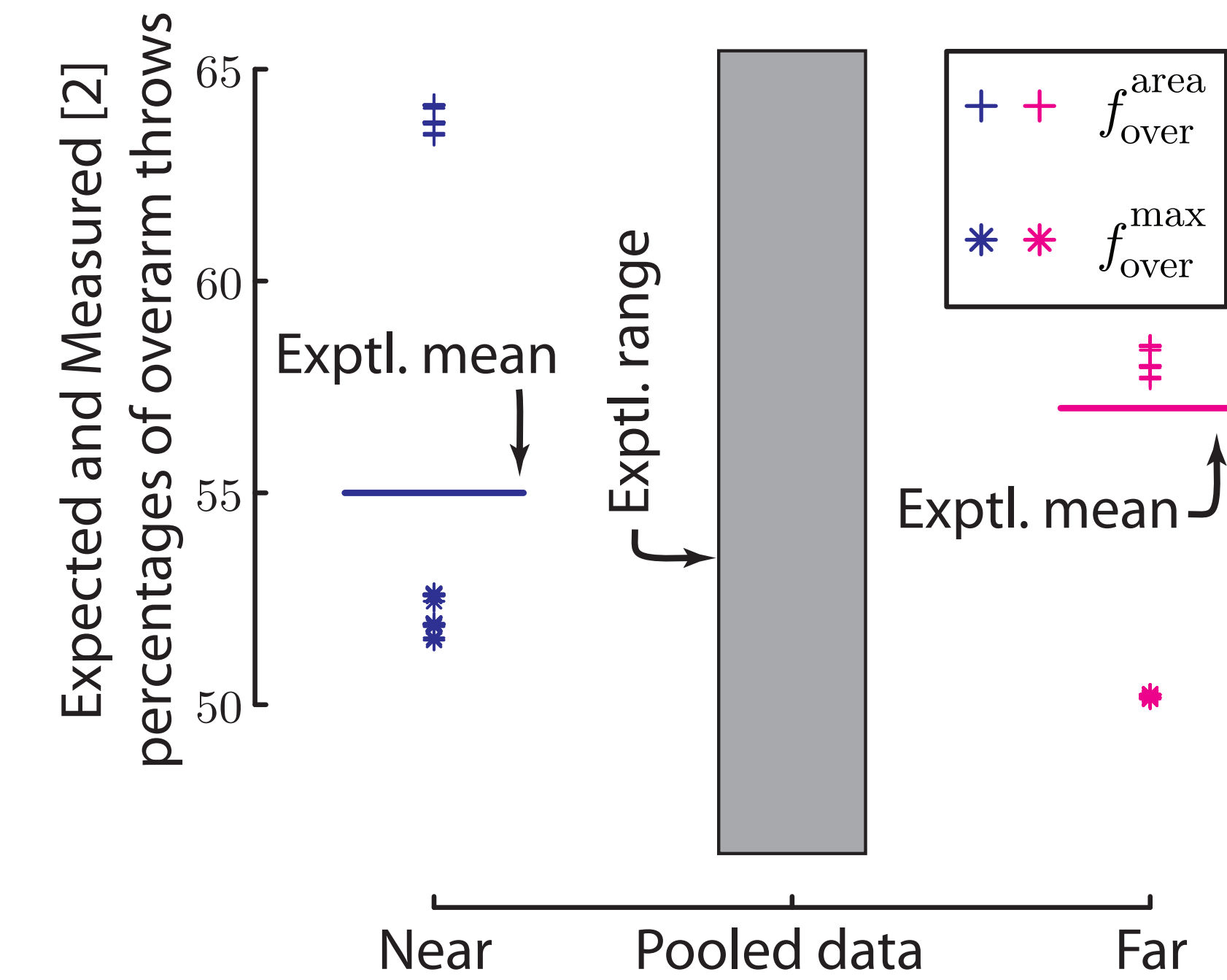
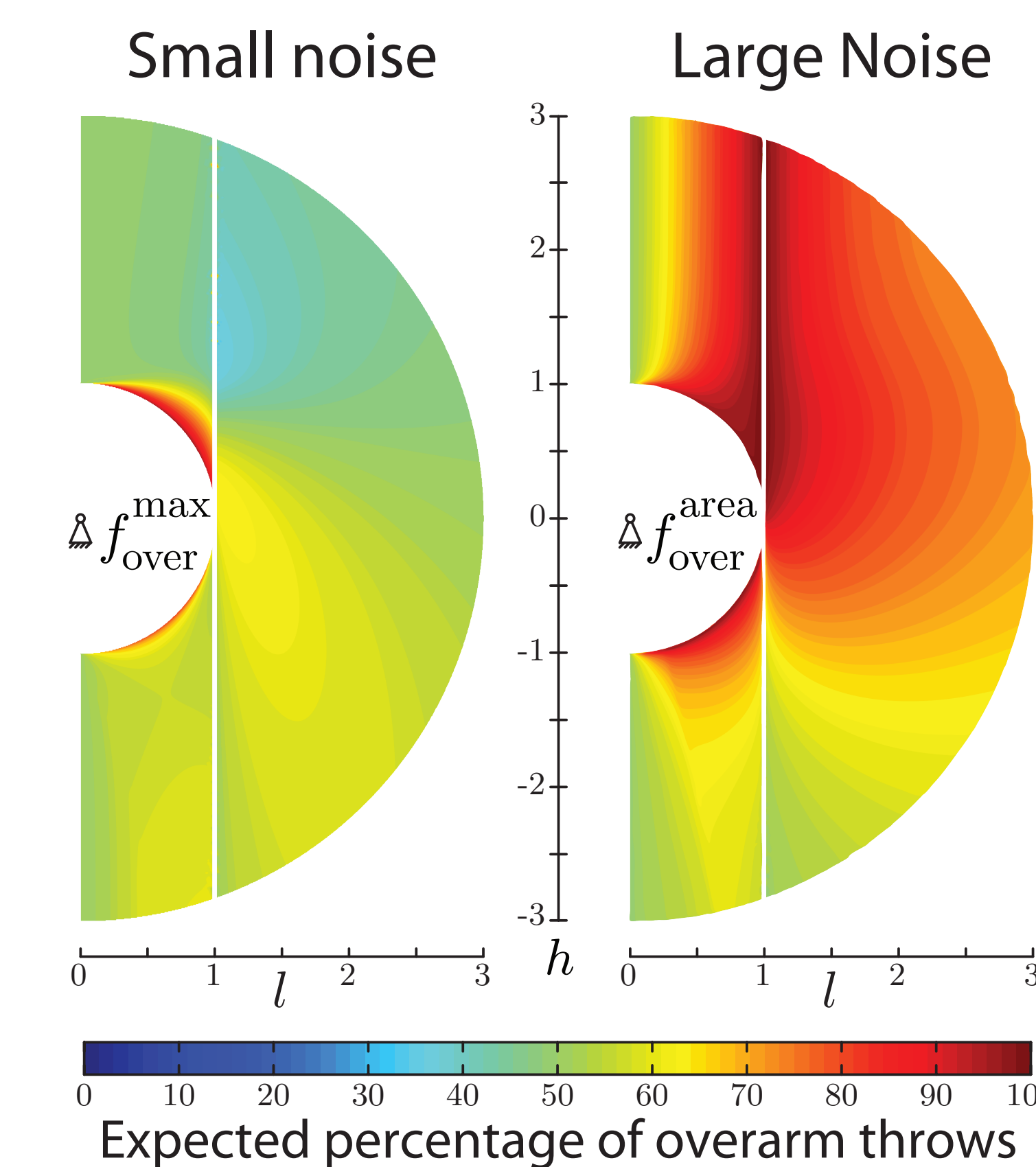
SMALL NOISE LIMIT

$$f_{\text{over}}^{\text{max}} = \frac{\max_{\phi} p_o(\phi)}{\max_{\phi} p_o(\phi) + \max_{\phi} p_u(\phi)}$$

LARGE NOISE LIMIT

$$f_{\text{over}}^{\text{area}} = \frac{\int_{\Phi} p_o(\phi) d\phi}{\int_{\Phi} (p_o(\phi) + p_u(\phi)) d\phi}$$

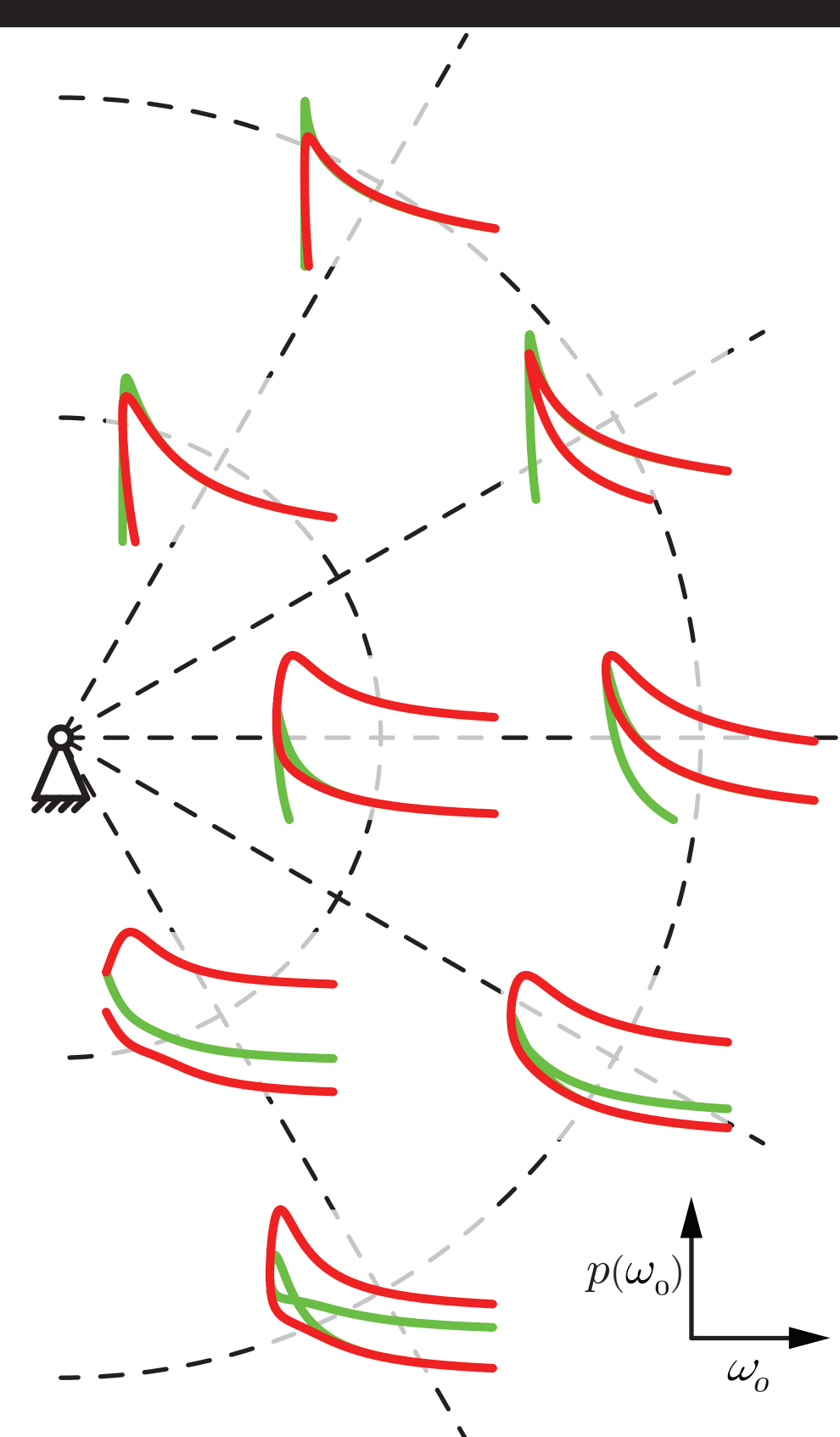
RESULTS & COMPARISON WITH DATA



- Recall that muscles have signal dependent noise [4].
- $f_{\text{over}}^{\text{max}}$ (*) should and indeed predicts the nearer target.
- $f_{\text{over}}^{\text{area}}$ (+) should and indeed predicts the farther target.
- Contour plots show distinct preferences for underarm and overarm throws depending on target location.

SPEED-ACCURACY TRADE-OFF

- Speed-accuracy trade-off emerges solely from projectile dynamics.
- This is an alternative to current theories that rely on signal dependent noise in muscles [4].
- At higher speeds, like in hunting, the overarm is far superior. A pivotal role in human evolution, by creating a pressure to develop better overarm skills?



REFERENCES & ACKNOWLEDGMENTS

1. Timmann, D, Watts, S, & Hore, J. (1999) J Neurophysiol 82, 103-114.
2. Westergaard, G. C, Liv, C, Haynie, M. K, & Suomi, S. J. (2000) Neuropsychologia 38, 1511-7.
3. Gablonsky, J & Lang, A. (2005) SIAM Review 47, 775-798.
4. Todorov, E. (2004) Nat Neurosci 7, 907-915.
5. Corresponding author: madhu@seas.harvard.edu
6. We acknowledge partial funding support for MV from Daniel E. Lieberman.