

# Non-gradient-based (Gradient Free) Function Optimization

*Goal: Review non-gradient approaches.*

Paper: Derivative-free optimization: A review of algorithms and comparison of software implementations, Book: Introduction to Derivative-Free Optimization

Maintain one or a small number of best candidates:

Hill climbing (including local search, local unimodal sampling, pattern search, random search, random optimization, simulated annealing)

Nelder Mead/Simplex/Amoeba method (Matlab fminsearch)

Iteratively fit deterministic surrogate functions to a number of samples and optimize the surrogate function

## Response Surface Methodology (RSM)

Iteratively fit probability distributions to a number of samples and use the distributions to choose next samples

evolutionary algorithms, genetic algorithms, and

...

Paper: Derivative-free optimization: A review of algorithms and comparison of software implementations by Luis Miguel Rios and Nikolaos V. Sahinidis, Book: Introduction to Derivative-Free Optimization

Iteratively fit probability distributions to a number of samples and use the distributions to choose next samples

## Covariance Matrix Adaptation Evolution Strategy.

*Goal: Understand currently popular state of the art method.*

See also [Hansen web page.](#) [Example1,](#) [Ex2,](#) [Ex3,](#) [Ex4.](#)

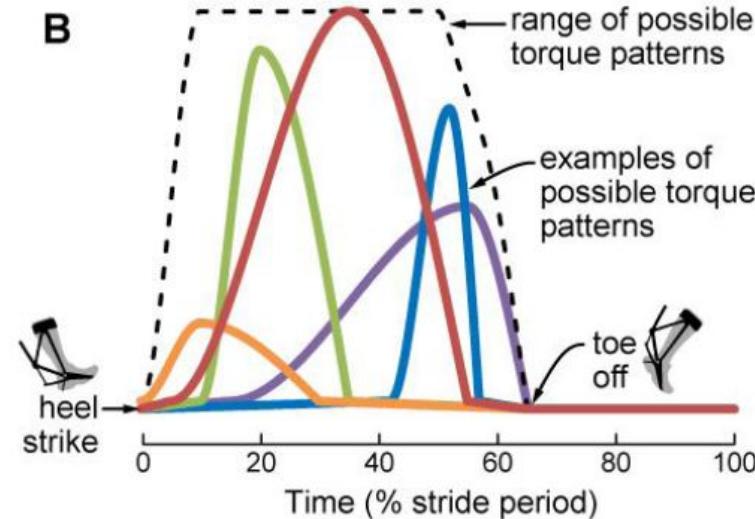
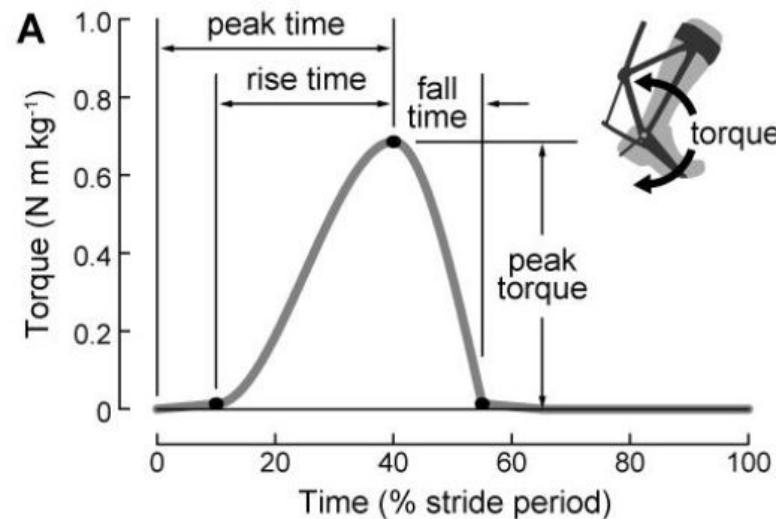
# Example 1:

## Assistive Exoskeleton

### HILO: Human In the Loop Optimization (= robot learning)



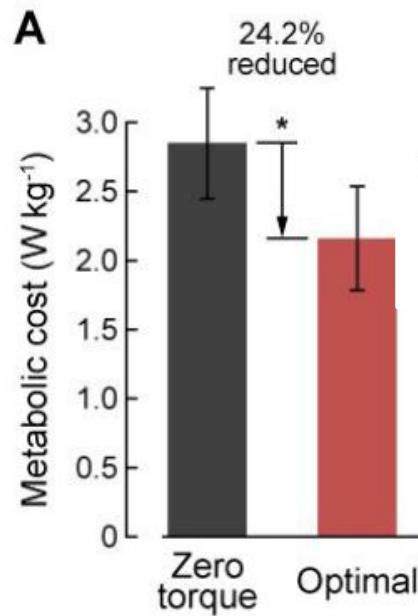
# Choosing parameters to optimize



Zhang, Fiers, Witte, Jackson, Poggensee, Atkeson, and Collins. *Science* 2017

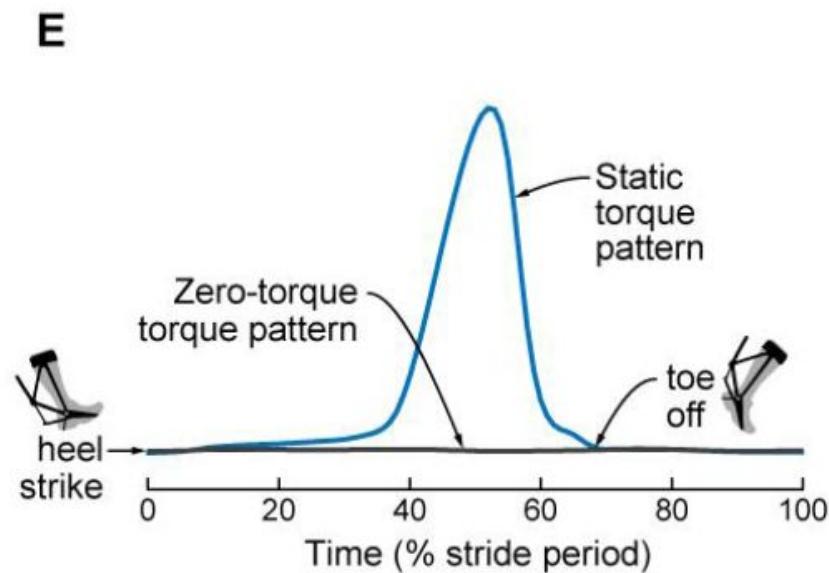
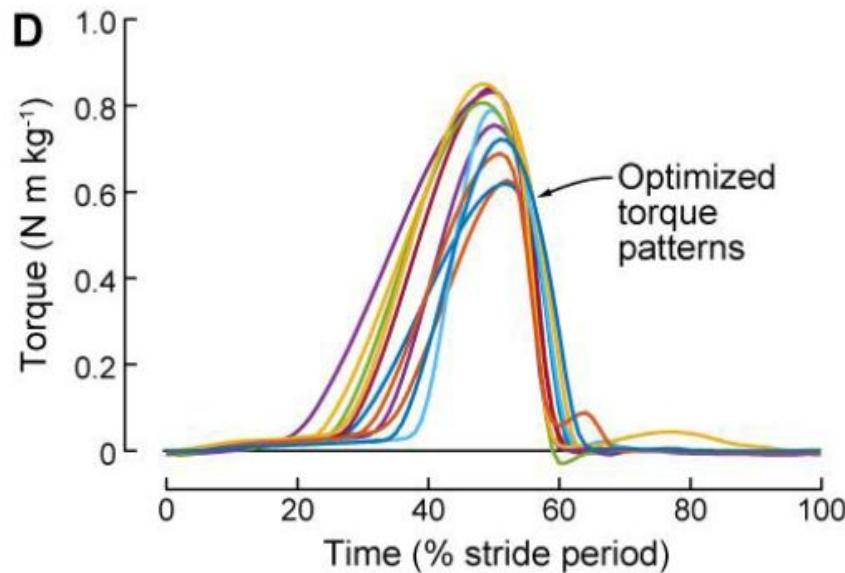
# Online non-gradient-based optimization (CMA-ES) outperforms manual tuning (24% vs 7% improvement)

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Zhang, Fiers, Witte, Jackson, Poggensee, Atkeson, and Collins. *Science* 2017

# Optimized settings highly variable among subjects



Zhang, Fiers, Witte, Jackson, Poggensee, Atkeson, and Collins. *Science* 2017

# Parallelizing Optimization

Limited scope to parallelize internals of gradient-based algorithms. Gradient-based algorithms are inherently serial.

Could optimize from many starting points in parallel (for any optimization approach).

Can evaluate optimization criterion for many points simultaneously so population-based optimization algorithms straightforwardly parallelize.