





**Compositionality:** The genetic code and language are examples of systems in which discrete elements can generate a large number of meaningful entities that are quite distinct from those of their elements

#### The Structure of Skeletal Muscle



## Modularity

 Does the vertebrate motor system construct movements combining discrete modular elements?

#### Evidence for muscle synergies ?

If a group of muscles is controlled as a unit, i.e. as a synergy, then the level of activity of those muscles should be correlated
 a



muscles

#### EMG recordings from 16 leg muscles



#### **Extraction algorithm**

 We developed an iterative algorithm to extract a set of timevarying synergies that minimize the total reconstruction error

[d'Avella & Tresch, NIPS 14]

## Synergy identification

-EMGs were averaged every 100ms

 The number of synergies was chosen as the minimum number that could explain at least 95% of the variation in the data

## Synergy validation

- Are the identified synergies just an arbitrary description of the constraints in the motor output?
- In support of a neural origin of synergies

   → synergy recruitment capture well the pattern
   of covariation across different episodes
   → similar synergies are extracted across
   behaviors

Focal microstimulation of the lumbar spinal cord has Revealed a small number of circuits that are organized to produce muscle synergies.



in the planning and instruction of voluntary movement







### Experimental trajectory procedure



#### Motor systems – levels of control



## Three kicking synergies



Compositionality - Combinations of Muscle Synergies in the Construction of Motor Behavior

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Synergies extracted from jumping swimming and walking











#### Motor control primitives in the spinal cord







Mussa-Ivaldi, Giszter and BizziCold Spring Harbor Symposium on Quantitative Biology, vol. 55 (1990)

Regions of the lumbar spinal cord containing the neural circuitry that specifies the force fields



## Tonic Forces



# Costimulation of the lumbar interneurons



#### **Summary of results**

- The muscle patterns recorded in a variety of natural behaviors can be reconstructed as combination of a small number of muscle synergies
- Synergies are similar across behaviors
- A few synergies are identified only in specific behaviors
- Some synergies have a single dominant muscle and they are part of the same sequence in different behaviors



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#### Motor systems – levels of control












### Examples of Cell Activity Recorded in the Primary Motor Cortex



### Two other types of memory cells



Compositionality - Combinations of Muscle Synergies in the Construction of Motor Behavior

**Emilio Bizzi Massachusetts Institute of Technology**  The finding that combination of synergies can explain our data suggest that our synergies may correspond to building blocks of the CPGs, sometimes formulated as a mosaic of "unit burst generators" (Grillner, 1985)

# Results

- The EMG patterns recorded during natural motor behaviors can be reconstructed by combinations of a few time-varying muscle synergies
- In some behaviors, there is a systematic relationship between synergy activation coefficients and features of the movement (e.g. kick direction)

#### Figure 4. Examples of swimming synergies from analysis stage I



Cheung, V. C. K. et al. J. Neurosci. 2005;25:6419-6434



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## Summary

The main finding is that both intact and deafferented behaviors are primarily generated by the same set of synergies.

## Modularity in the spinal cord

- 'Half-centers' for the control of rhythmic behaviors (e.g. locomotion) (Brown 1910, Jankowska 1967)
- Central pattern generators (CPGs) by combinations of 'unit burst generators' (Grillner 1981)
- Force field modules (Bizzi 1991)

#### Figure 9. Reconstructing the original EMGs with synergies and their coefficients



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## Motor systems – levels of control

