# How one might realize practical, energy-efficient legged robots: 19 thoughts/ideas from the Cornell Ranger project

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## Introduction to Cornell Ranger



- 1m tall, 9.91 kg, 4 legged knee-less biped.
- 6 on-board computers, around 30 sensors, 4 direct current motors, battery powered.
- Fully autonomous, except radio controlled steering.

Ranger Walking Video

## BIG goal

## Walk a marathon (26.2 miles) on a single charge.

- Energy-effective.
- Robust.
- Reliable.

#### Timeline of walks

```
3 December 2006: 0.6 mi, TCOT = 1.6
3 April 2008: 5 mi, TCOT = 0.6
5-6 July 2010: 14.3 mi, TCOT = 0.49
1-2 May 2011: 40.5 mi, TCOT = 0.28 (Distance record)
25 June 2011: 5 meters, TCOT = 0.19 (TCOT record)
```

#### NOTE:

Total Cost Of Transport (TCOT) =  $\frac{\text{Total energy used}}{\text{Weight} \times \text{Distance travelled}}$ 



# 1 Few degrees of freedom



#### Four degrees of freedom

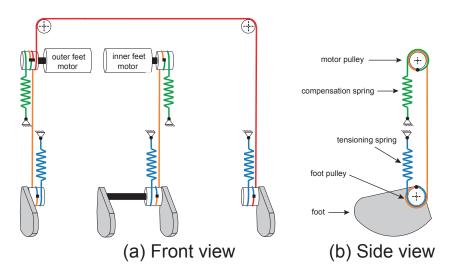
- 1 @ hip,
- 1 @ inner ankle,
- 1 @ outer ankle,
- 1 @ inner ankle twist.

# ② Mechanical layout: Heavy hip; light legs and feet



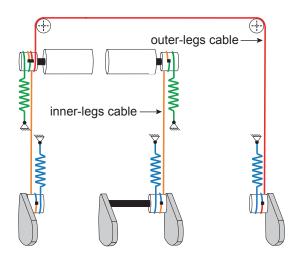
- Hollow carbon Fiber tubes for legs (light)
- High-strength aluminum for feet (light)
- Aluminum box shaped thighs.
  - High strength, high stiffness, light weight.
  - House motors and electronics. Attach batteries.

## 3 Cable drivetrain for ankles



This design moves ankle motors up near the hip and helps keep the feet light.

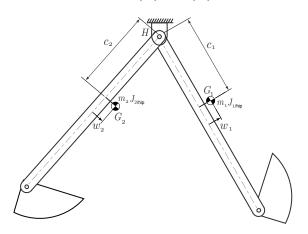
# 4 Cable drive symmetry



Stiffness of inner-legs cable should be twice that of outer-legs cable.

# 5 Dynamic symmetry

4 things to match  $m_1 = m_2$ ,  $J_{1/hip} = J_{2/hip}$ ,  $c_1 = c_2$ ,  $w_1 = w_2$ .



But only 3 conditions need to be met.

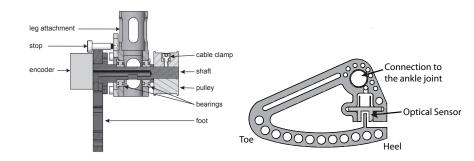
$$c_1 m_1 = c_2 m_2$$
,  $w_1 m_1 = w_2 m_2$ ,  $J_{1/hip} = J_{2/hip}$ 

These can be measured without dis-assembling the robot.



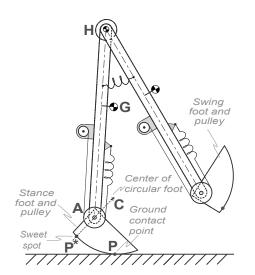


## 6 Foot as a load-cell



Gap at heel on foot  $\propto$  Vertical load. Gap measured by an optical sensor.

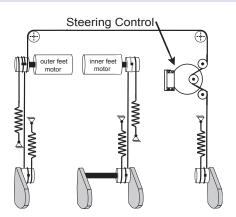
# 7 Circular shape foot



- Almost no motor torque when the sweet spot # is the ground contact point.
- Allows toe-off, push-off, flip-up for leg clearance.
- Model as rolling cylinder.

 $^{\#}$   $P^{\star}$  (sweet spot) = physical point on the foot where the line joining the center of circle to the ankle intersects the foot

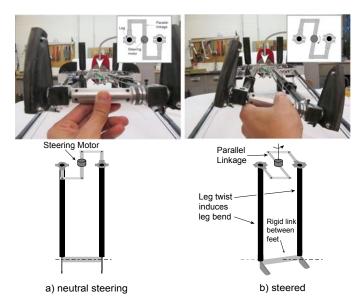




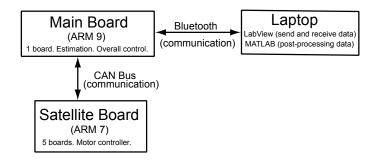
#### Turn by differential rotation of outer ankles.

- Robot ran into sand-pit in the 0.6mi attempt ending the walk.
- Robot almost went out of course during 5mi attempt.

# Steer a 2-D robot in 3-D (turn by twisting)



# 9 Overall electronics architecture

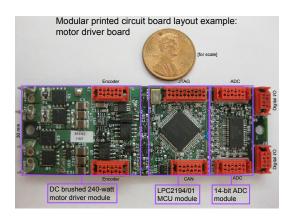


#### Distributed network-based sensing and control.

- Main controller (ARM-9): High level control and estimation.
- Control Area Network (CAN): Nervous system that is reliable and modular.
- Satellite controller (ARM-7): Joint level control and estimation.



# Custom built processor board



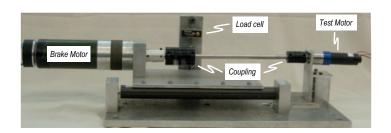
- Each satellite board controls a joint.
- Small footprint.
- Modular, i.e. allows for reuse of code and electronics.



Total overhead\* power = 5.15 W.

\*overhead = sensors, microprocessors, motor controllers

# Better DC motor model



## Need DC motor model for model based controller design.

#### We found:

- Load dependent friction ∝ Current.
- Brush contact resistance  $\propto \frac{1}{\text{Current}}$ .

# Specification sheets could be wrong/incorrect

#### We found:

- Motor terminal resistance twice of what was reported.
   (Doubled the resistive losses)
- Motor inductance a third of what was reported. (Energy losses in motor controller)
- Motor had brush contact resistance and this was not reported. (Increased the resistive losses)



# Model validation led to motor controller re-design

We fitted a physics based model of robot + actuators and then did a validation test.

Video: Ranger model fit

Gait Parameter	Experiment	Simulation
Step Time (s)	0.65	0.66
Step Length (m)	0.32	0.32
Velocity (m/s)	0.49	0.48
Double Stance Time (s)	0.02	0.008
Total COT •	0.55	0.38
Motor COT †	0.36	0.19

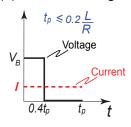
Percentage error in energetics is 47 %. Why?

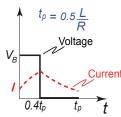


# Model validation led to motor controller re-design

#### (a) Efficient h-bridge

(b) Inefficient h-bridge

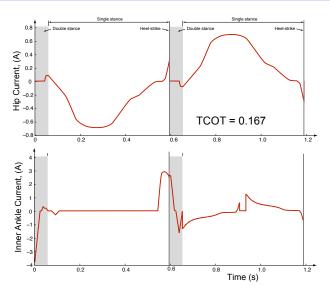




- Measured inductance was a third of reported value. We added more inductance.
- Motor controller frequency was increased from 20 kHz to 100 kHz.



## Optimal trajectory control



Use optimization to discover best way to move around.



# Walking cost does not dominate the total cost

Results of energy-optimal trajectory control

#### **Energy partition:**

- Electronics (Overhead): 49 %
   (Need more efficient electronics)
- Foot-flip (No-scuffing): 23 % (Would knees be a better idea?)
- 'Walk': 28 %

  ► Hip: 11 %
  - ► Ankles: 17 %

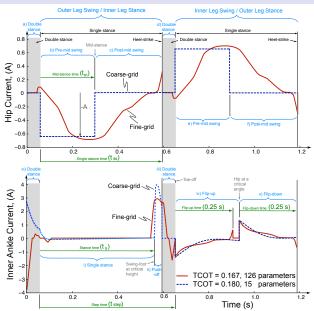
# Simplify and stabilize the optimal trajectory solution

Let control command be I (=current). Than,

$$I = I_{trajectory-generator} + I_{stabilization}$$

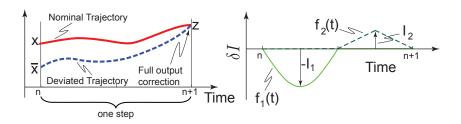
- Trajectory generator.
   Goal: Approximate energy-optimal trajectory.
- Stabilization.
   Goal: Stabilize the trajectory.

# Trajectory-generator: Approximate optimal trajectory



## Stabilization: Discrete intermittent linear feedback

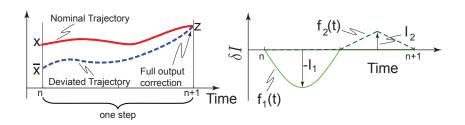
#### Fictitious example:



$$I = I_{trajectory-generator} + I_{stabilizing-control}$$
 ( $I = command current$ )

## Stabilization: Discrete intermittent linear feedback

#### Fictitious example:



$$\delta x_{n+1} = A\delta x_n + B\delta I_n$$
  
$$\delta z_{n+1} = C\delta x_n + D\delta I_n$$

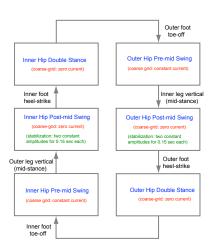
Find gain K using pole placements or linear regulator.

$$\delta I_n = -K\delta x_n$$

- x Measurements.
- z Quantity to be regulated.
- I Controls.

## Implementation on the robot

#### Example: Hip state machine .



- Concurrent augmented state machine.
- Reflex based control approach.

$$I = f(\text{full dynamical state})$$
$$= A + C_1\theta + C_2\dot{\theta} + D$$

 $\theta$ , I - angle and motor current. A,  $C_1$ ,  $C_2$  - constants. (trajectory-generator) D - constant (stabilization controller)

- No model based estimation.
- Push-off time is critical for energetics.

Could have done a better job.

- Error logs, Flashing Light Emitting Diodes.
- Rapid data logging and analysis capability.

Collect data while testing  $\to$  Robot fails  $\to$  Analyze data  $\to$  Understand failure  $\to$  Fix bugs  $\to$  Test again

### Ranger Team: 2006 - 2011

Principal Investigator: Andy Ruina

Lab Manager: Jason Cortell

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High school student: Ben Oswald



## Thank You

