# Simulating Continuous Systems Part 3

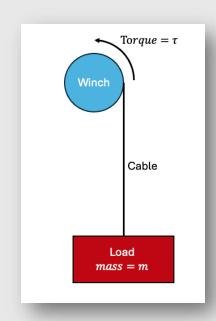
CMSC 326 Simulations

# Simulating Continuous Systems

Ricker Model of Population Growth



**Rotational Motion** 

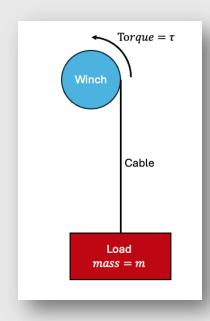


# Simulating Continuous Systems

Ricker Model of Population Growth



**Rotational Motion** 



Time is modeled by discrete time steps:

$$x(n) = population at step n$$

The Ricker model is:

$$x(n + 1) = r x(n) e^{-x(n)}$$

$$x(n+1) = r x(n) e^{-x(n)}$$

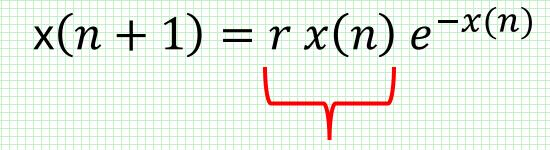
The population time step n+1

$$x(n+1) = r x(n) e^{-x(n)}$$

A calculation including the current population x(n)

$$x(n+1) = r x(n) e^{-x(n)}$$

Growth rate constant



The **population growth** part of the model

$$x(n+1) = r x(n) e^{-x(n)}$$

The **population decline** part of the model

One might expect the sequence

to converge to a "stable" population called an attractor

For each  $\Gamma$ , it seems plausible that we will get a different stable population for large enough n

$$x(n+1) = r x(n) e^{-x(n)}$$

```
# Population grown factor
r = 2
# Initialize population x(0)
x = 1
for n in range(500):
    # Compute the Ricker model formula
    x = r * x * np.exp(-x)
    print(f"n = \{n\}, r = \{r\}, x = \{x:0.4f\}")
```

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```
n = 489, r = 14, x = 0.4270
n = 490, r = 14, x = 3.9005
n = 491, r = 14, x = 1.1048
n = 492, r = 14, x = 5.1239
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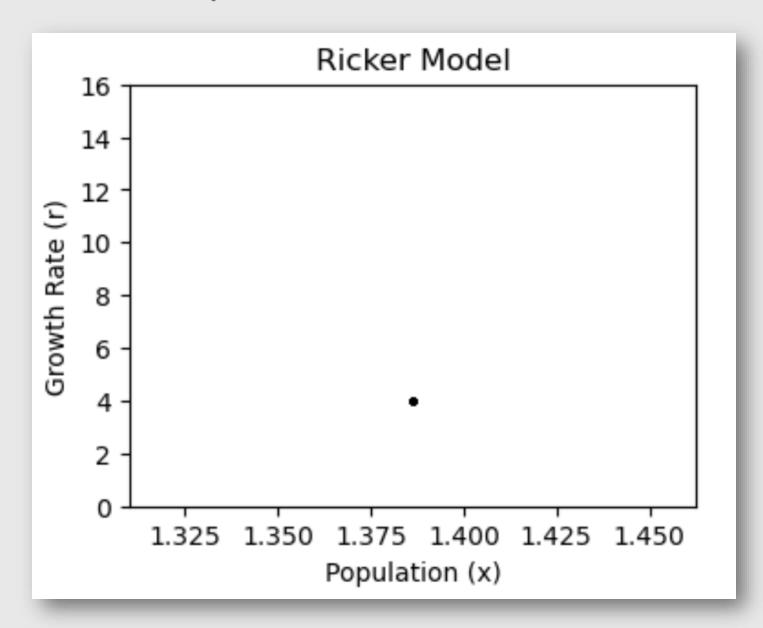
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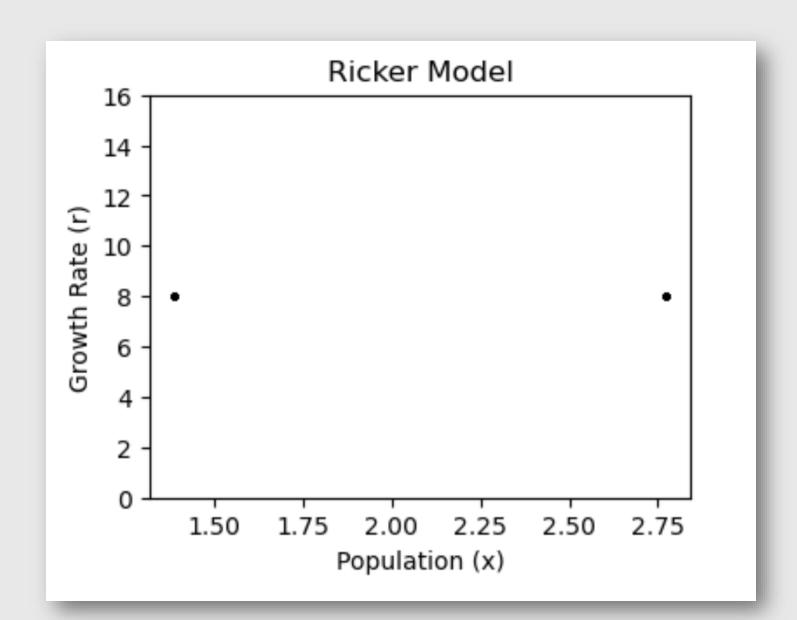
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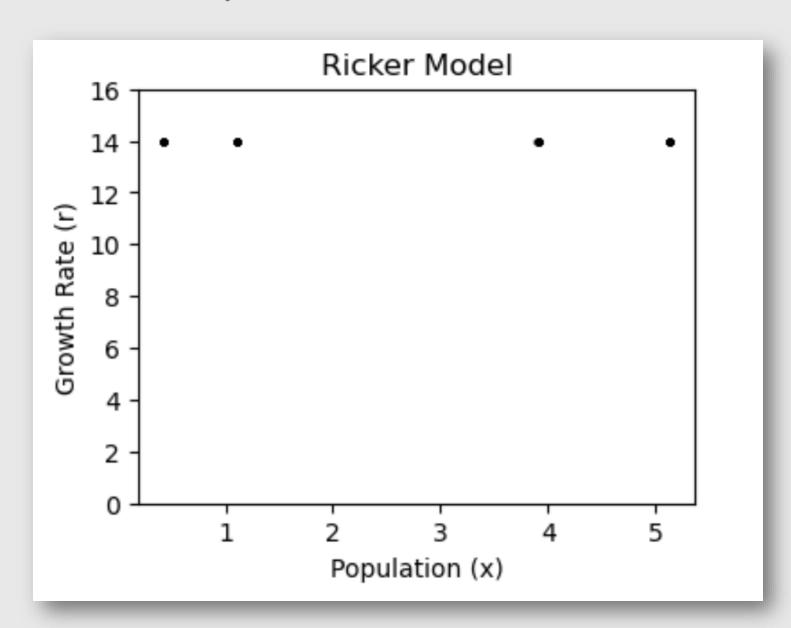
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#### What we'll do:

- 1. For a given r, run the sequence and compute a histogram of all the x(n) values obtained
- 2. If the sequence does in fact stabilize, we should see a single convergence point show up in the histogram
- 3. Plot any convergence point that shows up more than once, after ignoring x(1), ..., x(50) (to allow convergence)







Thus, we will have a collection of attractor points for any fixed r

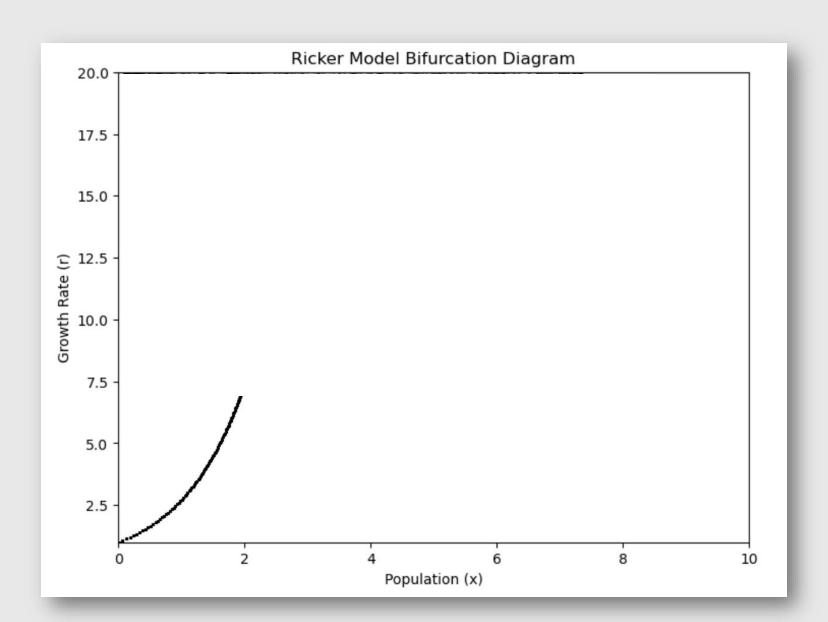
Plot the attractors for different values of r

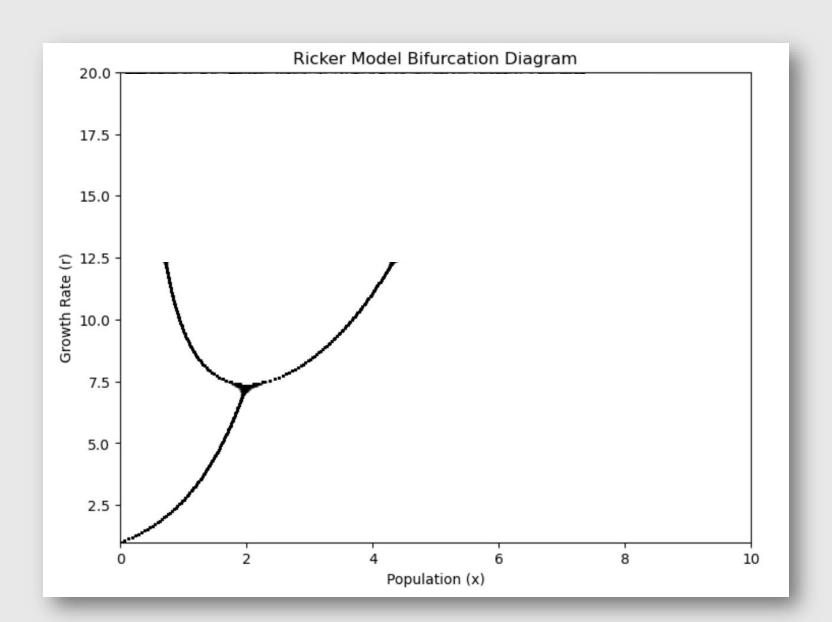
```
# Loop through values of r
r = 1.0
while r < r_lim:
    # Initial population x(0)
    x = 1
    # Iterate
    for n in range(500):
        x = r * x * np.exp(-x)
        if n > 50: # Ignore transient behavior
            x_vals.append(x)
            r_vals.append(r)
    r = r + delta_r # Increment r
```

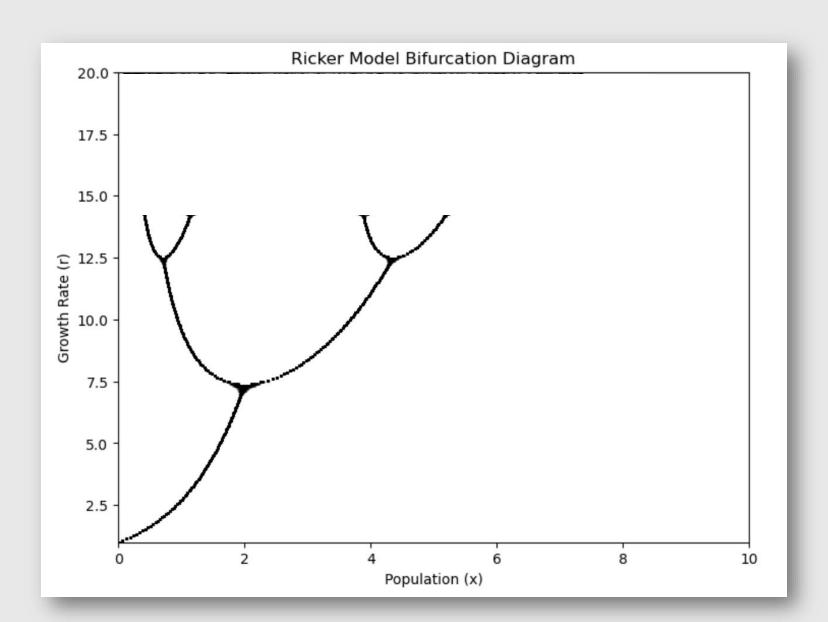
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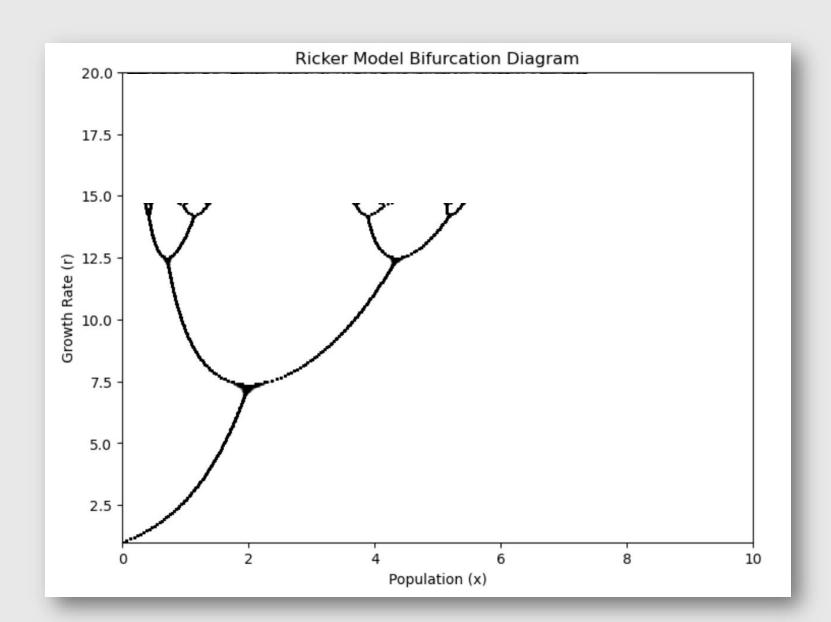
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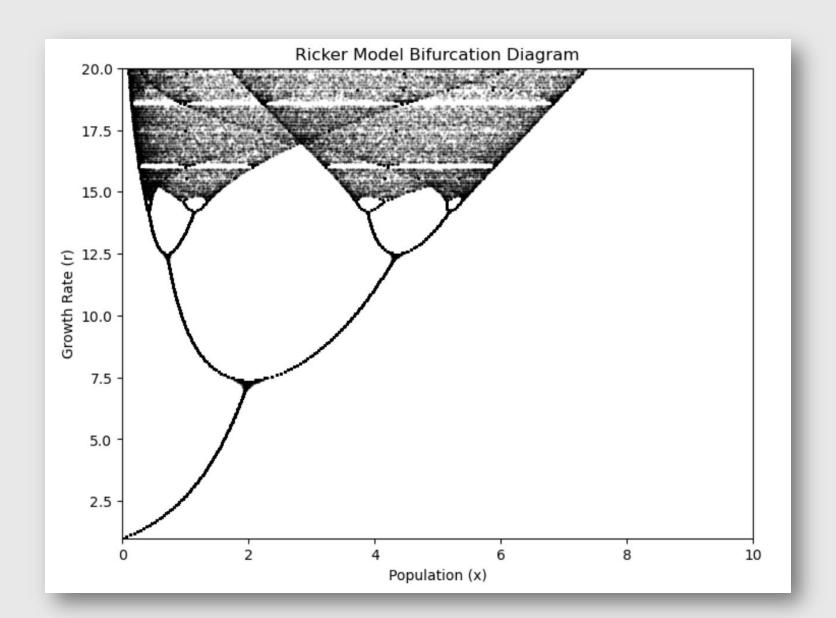
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            x_vals.append(x)
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## What do we learn from these examples?

A **changing system** can be mathematically modeled in many ways, the most common of which are:

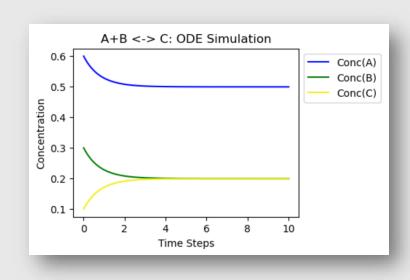
- 1. Fully continuous (differential equations)
- 2. Fully discrete
- 3. Mixed discrete and continuous (Ricker model)

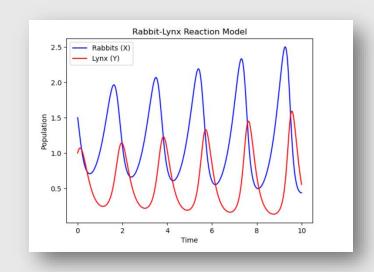
### What do we learn from these examples?

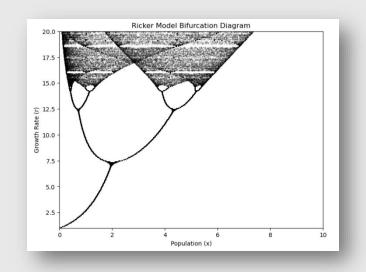
It is very hard to predict the behavior of dynamical systems just by staring at the governing equation

- For some parameters, a system might behave well
- For others, we might get wild oscillations or chaos

#### What do we learn from these examples?







$$A(t + s) = A(t) + s (K_c C(t) - K_{ab} A(t) B(t))$$

$$B(t+s) = B(t) + s \left( K_c C(t) - K_{ab} A(t) B(t) \right)$$

$$C(t+s) = C(t) + s (K_{ab} A(t) B(t) - K_c C(t))$$

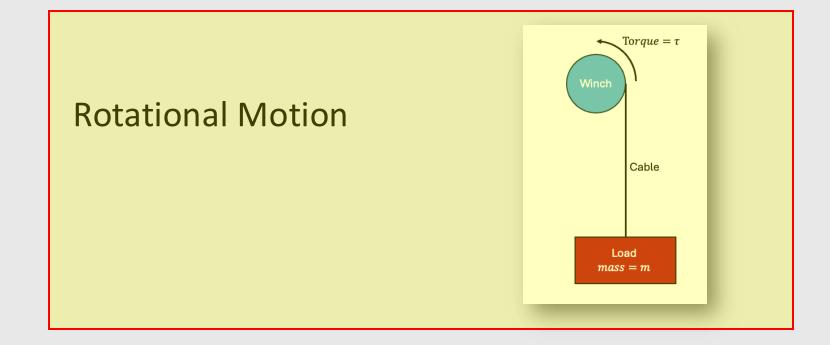
$$X(t+s) = X(t) + s (k_1 X(t) - k_2 X(t) Y(t))$$

$$Y(t + s) = Y(t) + s (k_2 X(t)Y(t) - k_3 Y(t))$$

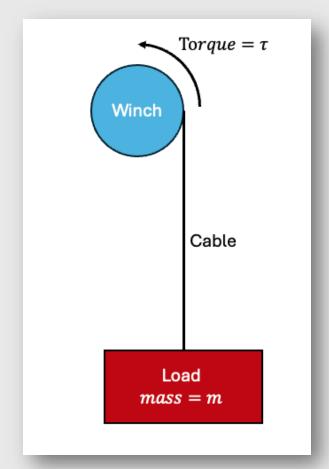
$$x(n+1) = r x(n) e^{-x(n)}$$

### Simulating Continuous Systems

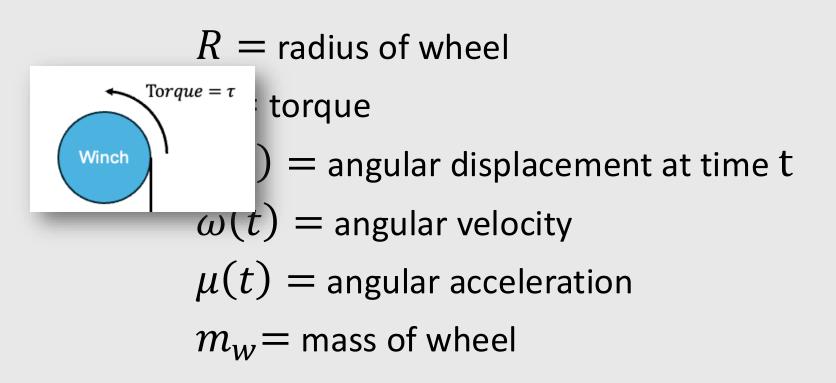




Consider a weight attached to a winch:

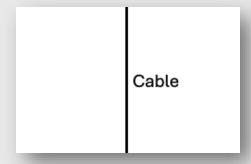


Define the following variables for the wheel:

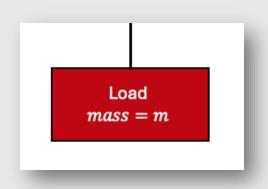


Define the following variables for the cable:

T =tension in the cable



Define the following variables for the wheel:



m = mass of load

y(t) = vertical displacement of load

v(t) = vertical velocity of load

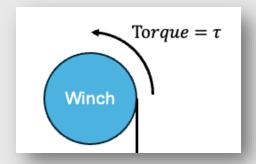
a(t) = vertical acceleration of load

### Apply Newton's Laws to Each Component

#### Let's start with the wheel:

- 1. The wheel has torque generated from the winch's motor: τ
- 2. The tension in the cable pulls the other way, and creates a reverse torque of  $T\ R$
- 3. The difference is what determines the angular motion of the wheel:

$$m_w R^2 \mu = \tau - TR$$

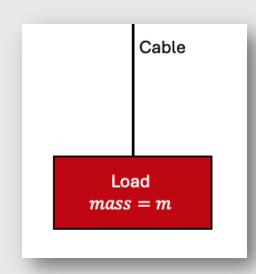


# Apply Newton's Laws to Each Component

#### Now the load:

- 1. The upward force is the cable's tension: T
- 2. The downward force is the weight  $m\ g$
- 3. The difference explains the motion:

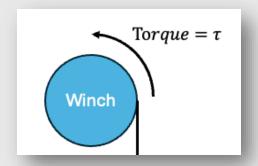
$$m a = T - m g$$



First, the ones relating displacement, velocity, and acceleration for the wheel:

$$\theta'^{(t)} = \omega(t)$$

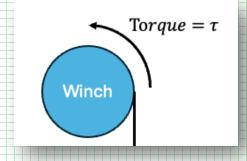
$$\omega'(t) = \mu(t)$$



The change in angular displacement over time

$$\theta'^{(t)} = \omega(t)$$

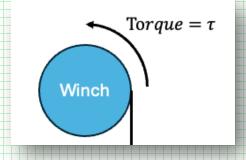
$$\omega'(t) = \mu(t)$$



$$\theta'^{(t)} = \omega(t)$$

Angular velocity

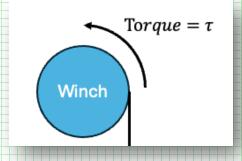
$$\omega'(t) = \mu(t)$$



$$\theta'^{(t)} = \omega(t)$$

The change in angular velocity over time

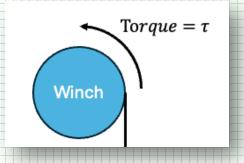
$$\omega'(t) = \mu(t)$$



$$\theta'^{(t)} = \omega(t)$$

$$\omega'(t) = \mu(t)$$

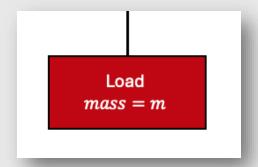
Angular acceleration



The same for the load:

$$y'(t) = v(t)$$

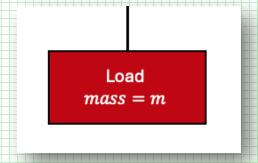
$$v'(t) = a(t)$$



The change in height over time

$$y'^{(t)} = v(t)$$

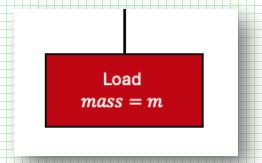
$$v'(t) = a(t)$$



$$y'^{(t)} = v(t)$$
 load

The velocity of the load

$$v'(t) = a(t)$$

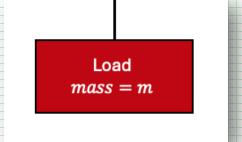


### What are the differential equations?

$$y'^{(t)} = v(t)$$

The change in velocity over time

$$v'(t) = a(t)$$

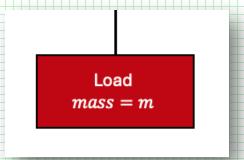


# What are the differential equations?

$$y'^{(t)} = v(t)$$

$$v'(t) = a(t)$$
 The acceleration of the

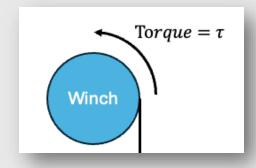
load



### Relate the Equations Through Tension

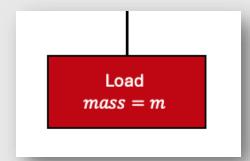
From the wheel:

$$T = \frac{\tau - m_w R^2 \mu}{R}$$



From the load:

$$T = m R \mu - m g$$



### Relate the Equations Through Tension

Equating the two and solving for  $\mu$ :

$$\mu(t) = \frac{\tau - m g R}{m R^2 + m_w R^2}$$

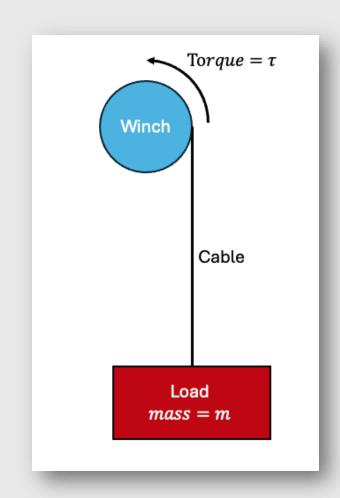
# **Equations That Describe the System**

$$\mu(t) = \frac{\tau - m g R}{m R^2 + m_w R^2}$$

$$\theta'(t) = \omega(t)$$

$$\omega'(t) = \mu(t)$$

$$y(t) = R \, \theta(t)$$



# **Equations That Describe the System**

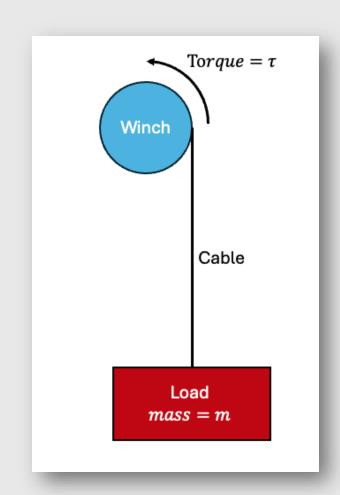
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The change in height of the load

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### **Equations That Describe the System**

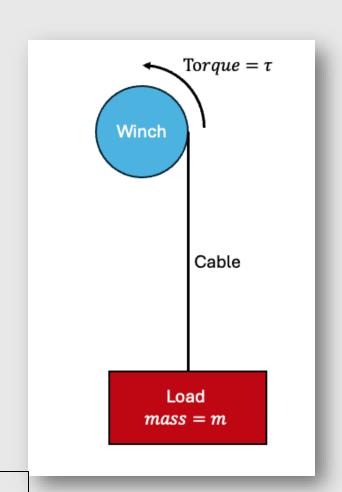
$$\mu(t) = \frac{\tau - m g R}{m R^2 + m_w R^2}$$

$$\theta'(t) = \omega(t)$$

$$\omega'(t) = \mu(t)$$

$$y(t) = R \theta(t)$$

Radius of the winch times angle of displacement



```
def step():
   # Advance the simulation by one time step
    t = t + delta t
    # Calculate the angular acceleration based tension
    angular_acceleration = (torque - m * g * R) / m * R**2 + mw * R**2
   # Calculate the angular velocity
    angular_velocity = angular_velocity + angular_acceleration * delta_t
    # Convert angular velocity to linear distance
    delta_angle = angular_velocity * delta_t
    y = y + delta_angle * R
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