

# Calculus for the Life Sciences I

## Lecture Notes – Chain Rule

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# Outline

- 1 Height and Weight
  - Introduction
  - Average Height and Weight of Girls
- 2 Chain Rule
  - Examples
- 3 Rate of Change in Weight
- 4 Normal Distribution
- 5 Hassell's Model

# Chain Rule

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- The differentiation of a composite function requires the **chain rule**

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- Height and age are approximated well by a **linear function**
- Height and weight of animals satisfies an **allometric model**

# Average Height and Weight of Girls

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## Average Height and Weight of American Girls

age (years)	height (cm)	weight (kg)	age (years)	height (cm)	weight (kg)
1	75	9.5	8	126	25.0
2	87	11.8	9	132	29.1
3	94	15.0	10	138	32.7
4	102	15.9	11	144	37.3
5	108	18.2	12	151	41.4
6	114	20.0	13	156	46.8
7	121	21.8			

# Average Height and Weight of Girls

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**Least Squares Best Fit:** Model of Height as a function of age

$$h(a) = 6.45a + 73.9$$

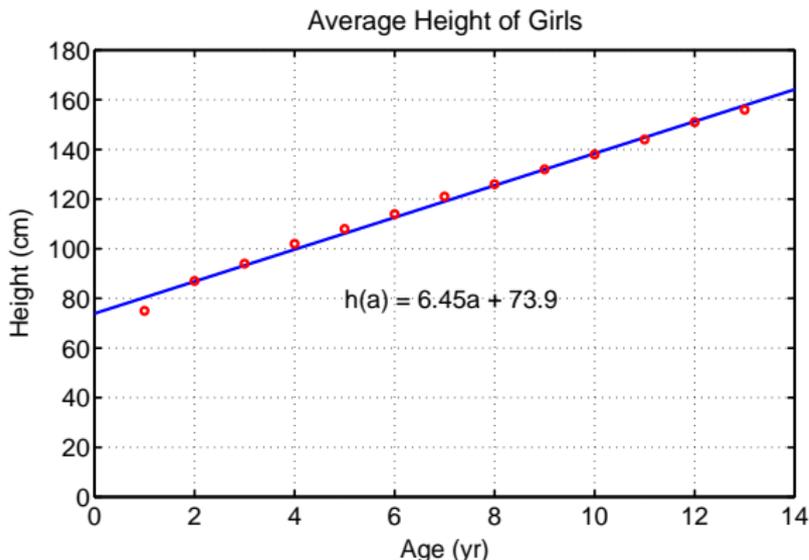
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Model shows that the average girl grows about **6.45 cm/yr**



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**Allometric Model:** An allometric model for the height and weight of a girl satisfies

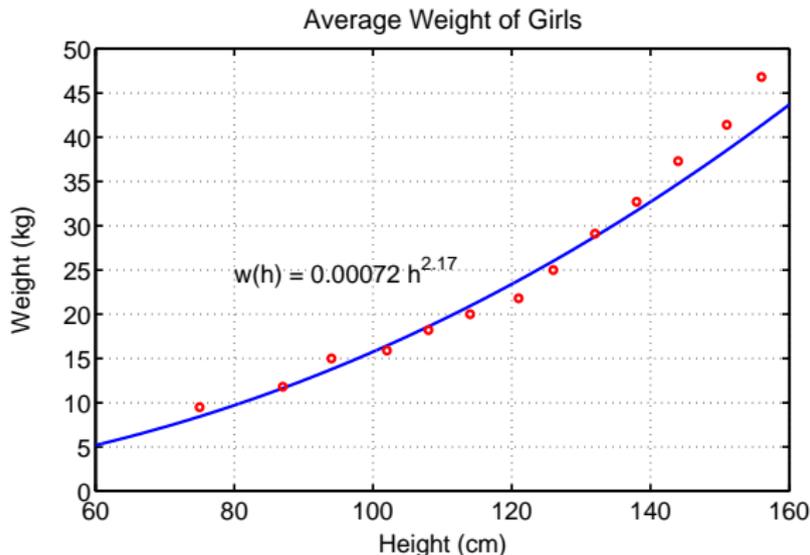
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  - The **Allometric Model** gives the weight as a function of height
  - Create a **composite function** of the **allometric model** and the **linear model** to give a function of the weight as a function of age
  - The **chain rule** gives the rate of change of weight with respect to age

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- Suppose that both  $f(u)$  and  $u = g(x)$  are differentiable functions
- The **chain rule** for differentiation of this composite function is given by

$$\frac{df}{dx} = \frac{df}{du} \frac{du}{dx}$$



## Example – Chain Rule

**Example - Chain Rule:** Consider the the function

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$$h'(x) = 6(x^3 - 4x^2 + e^{-2x})^5(3x^2 - 8x - 2e^{-2x})$$

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- The composite function weight as a function of age

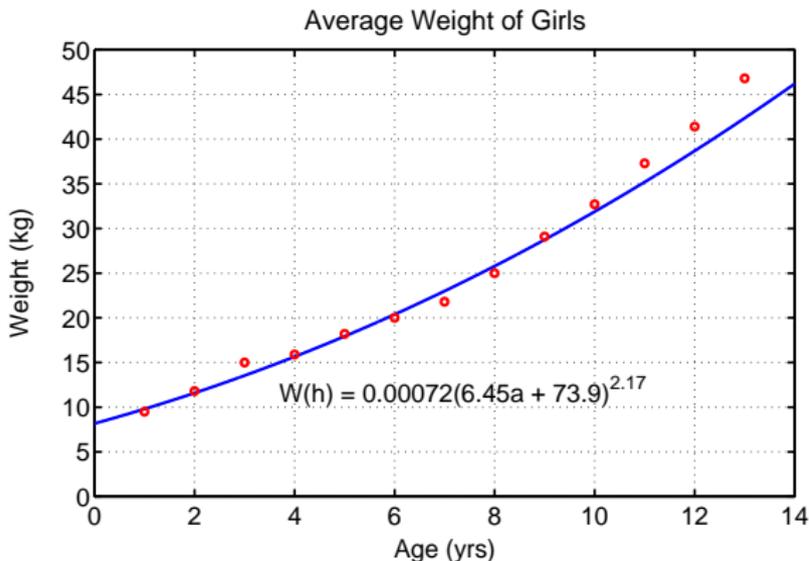
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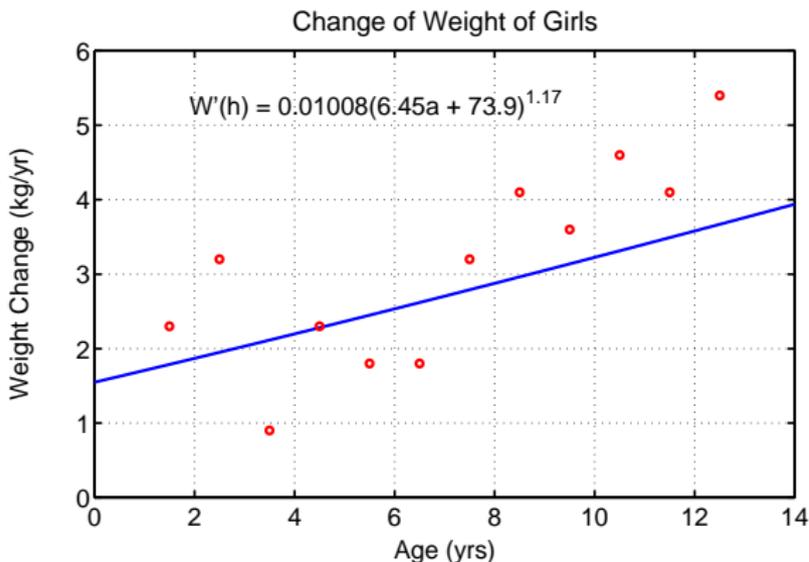
Combining these and substituting the expression for  $h$

$$W'(a) = 0.01008(6.45 a + 73.9)^{1.17}$$

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Change of Weight of Girls Graph of

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- We see that the model underpredicts the weight gain for older girls

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- $\sigma$  is the **standard deviation**
- $\mu$  is the **mean** of the distribution

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- Discuss the importance of the results

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The derivative is zero when  $x = \mu$ , so there is a maximum at  $(\mu, \frac{a}{\sigma})$

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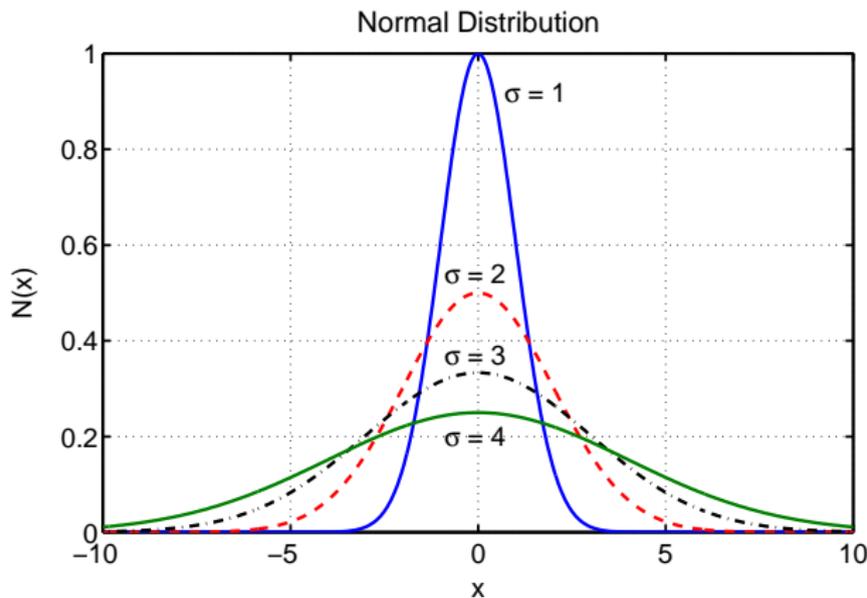
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$$N(\mu \pm \sigma) = \frac{a}{\sigma} e^{-\frac{1}{2}}$$

# Normal Distribution

**Solution:** Graph of the **Normal Distribution** with  $\mu = 0$  and  $\sigma = 1, 2, 3, 4$



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- The **area** under a **distribution function** is important in measuring **probabilities** and **confidence intervals** for statistics

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- Let  $P_0 = 200$ , then find  $P_1$  and  $P_2$

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- Let  $P_0 = 200$ , then find  $P_1$  and  $P_2$
- Find the intercepts, all extrema of  $H(P)$ , and any asymptotes for  $P \geq 0$

# Hassell's Model

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**Hassell's Model** is used in the study of insect populations

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- Graph  $H(P)$
- Determine the equilibria and analyze the behavior of the solution near the equilibria

## Hassell's Model

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**Solution:** For Hassell's model

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- This dramatic population swing suggests an instability

## Hassell's Model

3

**Solution (cont):** The **Updating function** is

$$H(P) = \frac{81P}{(1 + 0.002P)^4}$$

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- Differentiate the function

$$\frac{dH}{dP} = 81 \frac{(1 + 0.002P)^4 \cdot 1 - P \cdot 4(1 + 0.002P)^3 \cdot 0.002}{(1 + 0.002P)^8}$$

$$\frac{dH}{dP} = 81 \frac{(1 - 0.006P)}{(1 + 0.002P)^5}$$

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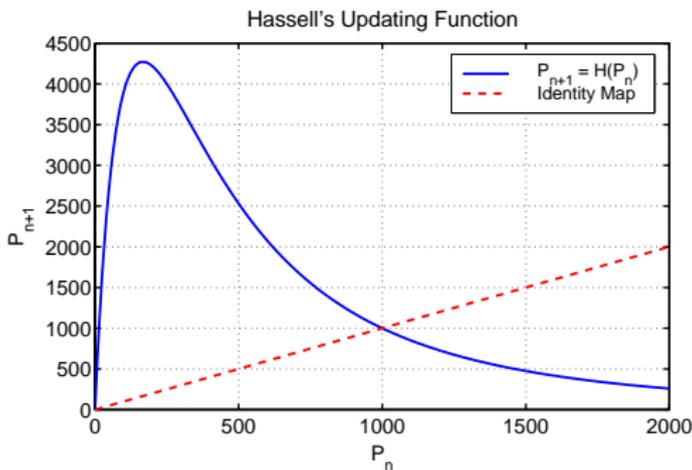
- With  $H(500/3) = 4271.5$ , the maximum occurs at

$$(166.7, 4271.5)$$

# Hassell's Model

**Solution (cont):** The graph of

$$H(P) = \frac{81P}{(1 + 0.002P)^4}$$



## Hassell's Model

6

**Equilibria for Hassell's Model:** The equilibria satisfy  
 $P_{n+1} = P_n = P_e$ , so

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$$P_e = 1000$$

## Hassell's Model

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- At  $P_e = 0$ ,  $H'(0) = 81 > 1$ , which implies that solutions monotonically grow away from 0
- At  $P_e = 1000$ ,  $H'(1000) = 81(-5)/243 = -5/3 < -1$
- We will show that this implies that the solution near this equilibrium oscillates and goes away from the equilibrium

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- At  $P_e = 1000$ ,  $H'(1000) = 81(-5)/243 = -5/3 < -1$
- We will show that this implies that the solution near this equilibrium oscillates and goes away from the equilibrium
- This model produces a **period 4** solution with the solution asymptotically oscillating from  $163 \rightarrow 4271 \rightarrow 42 \rightarrow 2453$

SDSU

# Hassell's Model

**Simulation:** Starting  $P_0 = 200$ , we simulate

$$P_{n+1} = \frac{81 P_n}{(1 + 0.002 P_n)^4}$$

