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# The effect of climate change on optimal wetlands and waterfowl management in Western Canada

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# 1.INTRODUCTION (1)

1. Warmer temperatures and a decrease in precipitation in the 21st century could severely deplete wetlands.
2. Drier conditions will have a major impact on the prairie pothole region (PPR)—North America's duck factory.
3. Study Area: southern parts of the Canadian prairie provinces of Alberta, Saskatchewan and Manitoba.

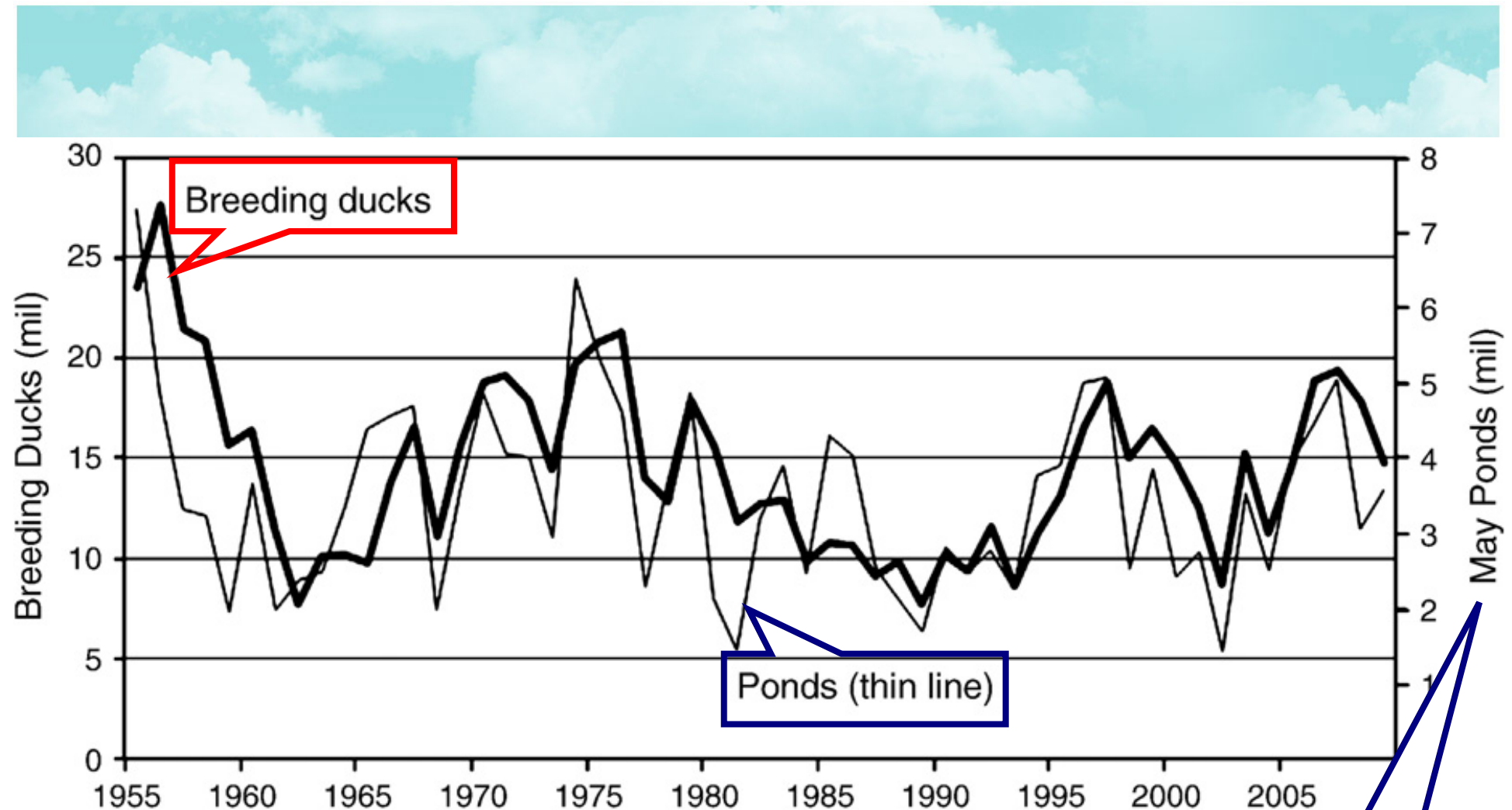


Fig. 1. Relationship between wetlands and waterfowl in Canada's Grain Belt, 1955 - 2009.

May – Sep.  
breeding season



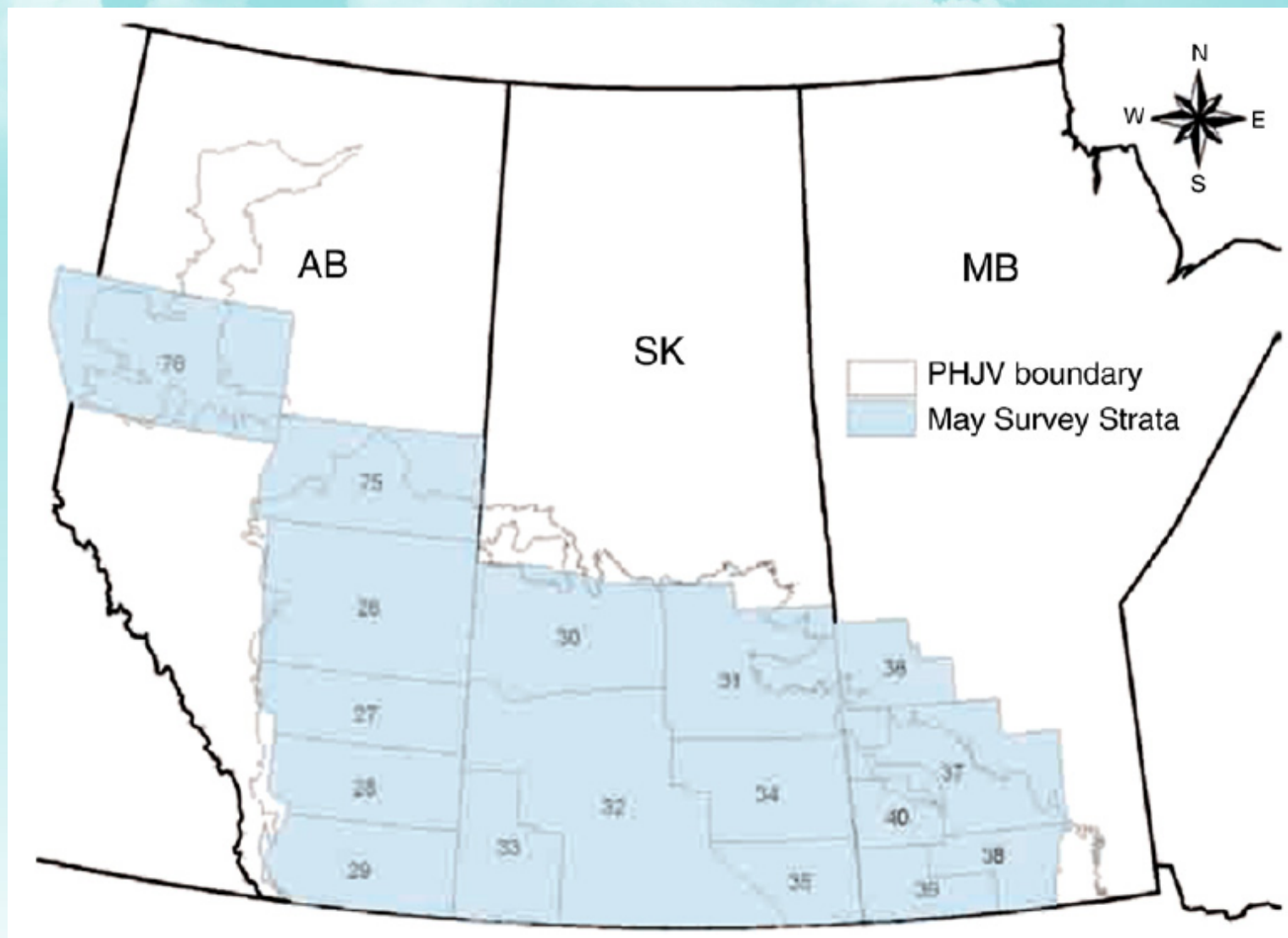


Fig. 2. The prairie pothole region of Canada.

# 1.INTRODUCTION ( 2 )

4. The Intergovernmental Panel on Climate Change (IPCC) predicts that surface temperatures around the globe could rise by between 1.1 and 6.4 °C by 2100.
5. Johnson et al. (2010), The regional climate models predict that temperatures could rise by 1.8 °C to 4 °C in the prairie pothole region.



# 1.INTRODUCTION ( 3 )

6. Study purpose: Use a **waterfowl–wetlands bioeconomic model** to solve for **socially optimal levels**
- ( 1 ) **breeding ducks ( $D_t$ )**.
  - ( 2 ) **duck harvests ( $h_t$ )**.
  - ( 3 ) **wetlands retention** under current climate conditions ( **$W_t$** ) .
  - ( 4 ) various climate change scenarios.

## 2.LITERATURE ( 1 )

1. Larson (1995) estimates the effect of temperature and precipitation on wetlands using **linear multiple regression analysis**.
2. She finds that the percentage of basins filled with water is a function of **this year** **frost seal** **precipitation** , **last year fall precipitation** , **fall maximum average temperature** , and the **difference between April minimum and maximum average temperatures**.

**snowmelt**

## 2.LITERATURE ( 2 )

3. For a 3 °C increase in temperature, wetlands are projected to decline by 15%.


decrease > increase

4. Coupled with an increase (decrease) in precipitation of 10%, wetlands are projected to increase (decrease) by 2% (31%).

$W \propto 1/T$ ,  $W \propto P$

5. Sorenson et al. (1998) regressed May ponds on average May Palmer Drought Index (PDI); they find  $R^2=0.72$ , indicating that the PDI explains a great deal of the variation in wetlands.

## 2.LITERATURE ( 3 )

6. Their results show that severe drought (PDI=-3.4) will decrease wetlands by 54%, whereas mild drought (-1.2) will decrease wetlands by 23%. 
7. For an increase in temperature of 1.5 °C (2.5 °C) coupled with an increase in precipitation of 7% (15%), wetlands decrease by 15% (15%).
8. Larson and Sorenson's studies find the changes in wetlands are more sensitive to temperature changes than precipitation.



## 2.LITERATURE ( 4 )

9. Johnson et al. (2005) use the **WETSIM simulation model** to estimate the spatial impact of wetlands in the following scenarios:



- (1) An increase in temperature of a **3 °C** and **no precipitation** change;
- (2) A **3 °C** increase in temperature and a **decrease 20%** precipitation ;
- (3) A **3 °C** increase in temperature and **increase 20%** precipitation

result: 2


**±20% in 100 years**



## 2.LITERATURE ( 5 )

(A) If **precipitation** is constant or decreasing, **wetlands** will decrease and **waterfowl** habitat will be pushed to the north and east.



(B) At 3rd scenario, precipitation **increase of 20%**, offset the effect of temperature.

10. Johnson et al. (2010) suggest that all prairie **wetlands** will suffer due to **temperature** of **warming**; the **order** in which wetlands are susceptible increases from **temporary wetlands** to semi permanent wetlands to seasonal ones. 

11. Johnson's **spatial analysis** sheds light on where the **retention** of wetlands might occur.

# 3. MULTIPLE REGRESSION MODEL (1)

## 3.1 Regression Model

1. We employ **two linear regression equation** to estimate the impact of climate change on wetlands. 
2. The first specification relies solely on the direct impact of **drought** on wetlands, similar to Sorenson et al. (1998), with the **standardized precipitation index (SPI)** index used as the  drought measure rather than the **PDI**.

### 3.MULTIPLE REGRESSION MODEL ( 2 )

3. The second specification is similar to Larson (1995), with wetlands (**pond numbers**) regressed on the climate variables **temperature** and **precipitation**.
4. **Lagged values** are considered for both SPI and precipitation, given that precipitation in previous years impacts **wetland numbers**. (Fig. 3)

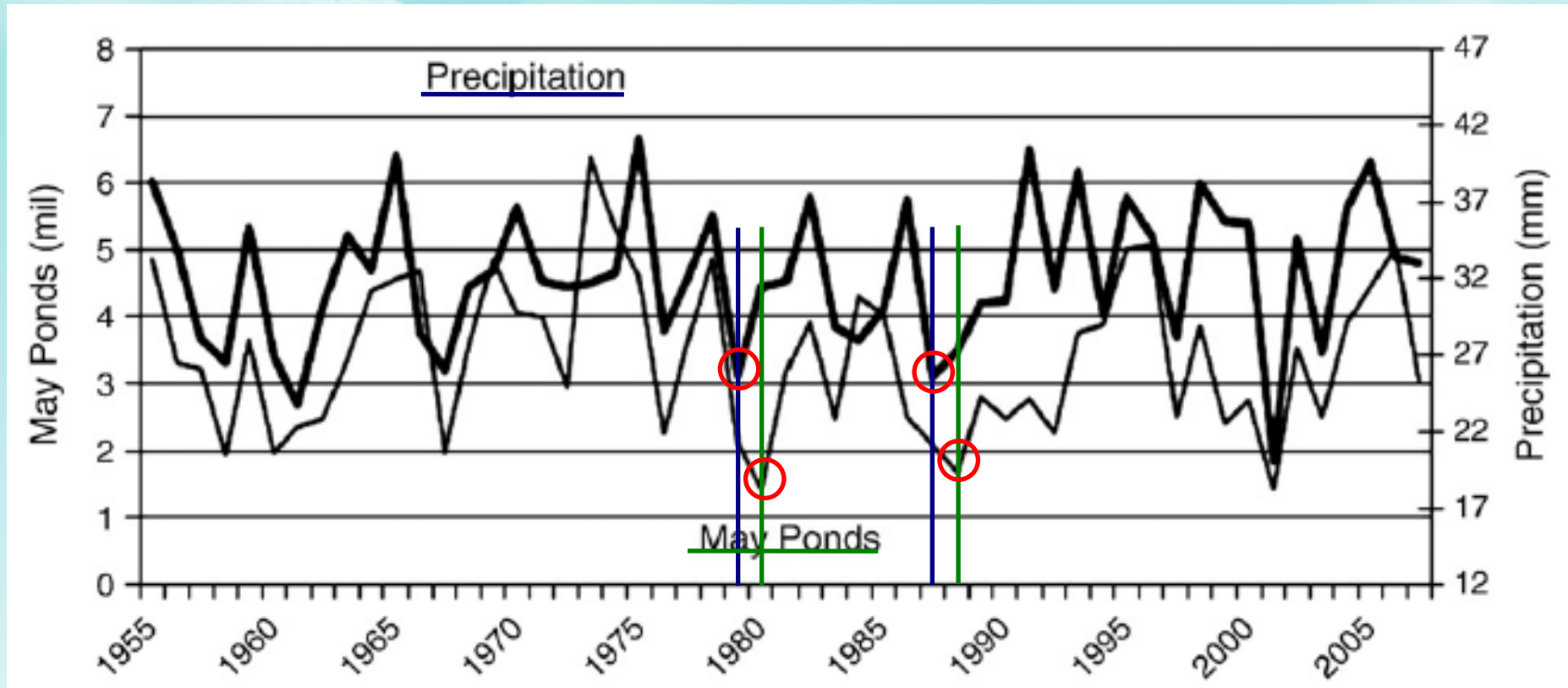


Fig. 3. May ponds and lagged precipitation in the Canadian PPR.

### 3.MULTIPLE REGRESSION MODEL ( 3 )

5. In each case, the final regression model is chosen on the basis of **adjusted  $R^2$**  and **statistical significance**.



### 3.MULTIPLE REGRESSION MODEL ( 4 )

6. The final specifications of the alternative regression equations are as follows:

$$W_t = \beta_0 + \beta_1 SPI_{t-1} + \varepsilon_t \quad (1)$$

$$W_t = \gamma_0 + \gamma_1 P_{t-1} + \gamma_2 T_{t-1} + \xi_t \quad (2)$$

Where

$W_t$  : refers to wetlands (number of ponds) in period t,

$SPI_{t-1}$  : lagged value of SPI;

$P_{t-1}$  : lagged value of precipitation;

$T_{t-1}$  : lagged average annual maximum temperature;

$\beta_s, \gamma_s$  : model parameters to be estimated;

$\varepsilon_t, \xi_t$  : assumed to be independent and identically distributed error terms

that are normally distributed.

# 3.MULTIPLE REGRESSION MODEL ( 5 )

## 3.2 Regression Results

1. The two regression equations were estimated using **wetlands data** from the annual May waterfowl breeding population and habitat surveys conducted by the **United States Fish and Wildlife Service** and the **Canadian Wildlife Service**.
2. We use May pond counts in the southern prairie provinces, corresponding to U.S. Fish and Wildlife Service's strata 26–40, for the **period 1955–2007**.

### 3. MULTIPLE REGRESSION MODEL ( 6 )

3. Eqs. (1) and (2) are estimated by ordinary least squares:

$$W_t = 2.9 + 3.33SPI_{t-1}, \quad R^2=0.3, S.E=0.95 \quad (3)$$

$$W_t = 3.138 + 0.0085P_{t-1} - 0.31T_{t-1}, \quad (4)$$

Where

W : measured in millions of May ponds.

SPI : an index.

P : in millimeters.

T : in degrees Celsius.

$R^2=0.36, S.E=0.91$

**COMMENT:**

**No statistical significance  
of the regressors**

### 3. MULTIPLE REGRESSION MODEL (7)

4. Model (4) includes temperature and precipitation and leads to a **higher  $R^2$**  value, although neither (3) nor (4) produce an  $R^2$  as high as that found by Larson (1995) or Sorenson et al. (1998).

$R^2=0.72$ (PDI)

$R^2=0.63$   
(precipitation and temperature)

**COMMENT:**  
The results were not as good  
as the literature.



# 4. BIOECONOMIC MODEL ( 1 )

## 4.1 Analytical Model

1. Maximizes the following objective function:

$$\sum_{t=1}^T [v(h_t, y_t, z_t) + \alpha D_t + B(W_t) - C(W_t)] \rho^t \quad (5)$$

Where

**Benefit from hunting**

**Benefit from non-hunting**

**Benefit from wetland restoration**

**Potential value of ducks which are not hunted**

**Adjustment for the value**

$z_t$  : demographic characteristics

$\alpha$  : non-use value

$D_t$  : mature ducks returning to the breeding

$W_t$  : wetland pond number

$\rho = 1/(1+r)$  : discount factor with  $r$  the discount rate.

$T$  : length of planning horizon

$V(h_t, y_t)$  : value derived from duck hunting;

$B(W_t) - C(W_t)$  : net benefits from wetlands (measured in millions of ponds)



## 4. BIOECONOMIC MODEL ( 2 )

2. The dynamics of duck numbers is given by:

$$D_{t+1} = s_2 [s_1 D_t + g(D_t, W_t) - \pi h_t] \quad (6)$$

$$D_t \geq 0, h_t \geq 0, W_t \geq 0, \text{ and } D_0 > 0, W_0 > 0 \quad (7)$$

Where

$S_1$  : fraction of May breeders **surviving to September**

$S_2$  : fraction of mature ducks that are not killed by hunters  
and survive to **return to the breeding** grounds in year  $t+1$   
(so  $1-s_2$  is the natural mortality during this period)

$g(D_t, W_t)$  : the number of offsprings

$\pi > 1$  : accounts for the loss of ducks that are killed remained  
by hunters but **not collected or reported**

$D_{t+1}$  : number of mature ducks returning to the prairie  
pothole breeding grounds in year  $t+1$

## 4. BIOECONOMIC MODEL ( 3 )

3. The number of offsprings that are produced is given by the recruitment function  $g(D_t, W_t)$ , where


$$\partial g / \partial D_t > 0, \quad \partial^2 g / \partial D_t^2 \leq 0$$

$$\partial g / \partial W_t > 0, \quad \partial^2 g / \partial W_t^2 \leq 0$$

**Growth curve :  
logistic model**

**Baby Duck function**

## 4. BIOECONOMIC MODEL ( 4 )

4. Applying Bellman's principle of optimality leads to the following recurrence relation known as Bellman's equation (Leonard and van Long, 1992, pp.174–176): 

$$V_t(h_t, D_t, W_t, \lambda_{t+1}) = \underset{h_t, W_t}{\text{Maximize}} \{ [v(h_t, y_t, Z_t) + \alpha D_t + B(W_t) - C(W_t)] + \rho V_{t+1}(D_{t+1}) \} \quad (8)$$

Lagrange multiplier method 

Where

$V_t$  : value function

$\lambda_t = \partial V_t / \partial D_t$  : shadow price of an additional duck.

$\partial V_t / \partial h_t = 0$  and  $\partial V_t / \partial W_t = 0$

**Maximum  
economic value**

## 4. BIOECONOMIC MODEL ( 5 )

5. Assuming an interior solution, the first-order conditions are:

$$\partial V_t / \partial h_t = \partial v / \partial h_t - \rho \lambda_{t+1} s_2 \pi = 0 \quad (9a)$$

$$\partial V_t / \partial W_t = B'(W_t) - c + \rho \lambda_{t+1} s_2 \partial g / \partial W_t = 0 \quad (9b)$$

$$\partial V_t / \partial D_t = \lambda_t = \rho \lambda_{t+1} s_2 (s_1 + \partial g / \partial D_t) \quad (9c)$$

Where

$c = Dc / dW_t$  : annual cost of providing an additional pond in each period.2





## 4. BIOECONOMIC MODEL ( 6 )

6. Letting  $\lambda_{t+1} = \lambda_t$  and  $D_{t+1} = D_t, \forall_t$ , we can identify for three equations that characterize the steady-state conditions:

$$B'(W) + \frac{1}{\pi} \frac{\partial v}{\partial h} \frac{\partial g}{\partial W} = c \quad (10a)$$

$$\left( s_1 s_2 + s_2 \frac{\partial g}{\partial D} - 1 \right) + \frac{\pi s_2}{\partial v / \partial h} \alpha = r \quad (10b)$$

$$(1 - s_1 s_2) D = s_2 g(D, W) - \pi h \quad (10c)$$

Solve the parameters: **W**, **D**, **h**



## 4. BIOECONOMIC MODEL ( 7 )

### 4.2. Calibrating the Bioeconomic Model

1. Lacking information on the **value of ducks to hunters**, we adapt the valuation equation estimated by Brown and Hammack (1973) and adjust all values by the U.S. CPI. The resulting function is  **$v(h)=1.62 h^{0.409}$** .
2. Using this function, we find that the value of harvesting an additional duck at current levels of harvest is **quite small**.
3. To address this problem, we adjust the function by weighting it by the **number of hunters**.

## 4. BIOECONOMIC MODEL ( 8 )

4. There was an average of **808,500 U.S.** duck hunters in the Mississippi, Central and Pacific flyways during 2007–2008, spending an average of **7.2 days** in the field and harvesting **15.2 ducks** (Table 1).

Flyway	Year	Harvest	Hunters	Harvest per hunter	Days afield	Days per hunter
Mississippi	2007	6,719,700	474,400	14.2	3,479,100	7.3
	2008	6,522,900	466,400	14.0	3,410,000	7.3
Central	2007	2,666,000	193,400	13.8	1,127,400	5.8
	2008	2,086,000	178,300	11.7	946,100	5.3
Pacific	2007	3,441,000	147,500	23.3	1,269,900	8.6
	2008	3,300,600	157,700	20.9	1,303,300	8.3
U.S. Totals	2007	14,578,900	995,700	14.6	6,978,400	7.0
	2008	13,723,200	980,500	14.0	6,686,400	6.8

## 4. BIOECONOMIC MODEL ( 9 )

5. Little is known about non-U.S. (mainly Canadian) hunters, except for what data are available which indicates that they spend **less time** in the field and kill **fewer birds**.
6. Therefore, we assume that the average hunter spends **7 days** in the field to harvest **14.5 birds**. Loomis (2000) finds an average value of a wilderness recreation **day** to be **\$39.61** in **1996** US dollars, or **\$53.83** in **2008** after **adjusting for inflation**.

## 4. BIOECONOMIC MODEL ( 10 )

7. Given these values, **each bird** is worth approximately **\$26**. Multiplying this value by the average 2007–2008 harvest yields a total benefit of **\$319.8 million**.
8. Assuming that the superscripted parameter on harvest in the above hunter valuation **function is 0.4**, He calculate  **$v(h)=114.58h^{0.4}$** , with  $v(h)$  and  $h$  measured in millions.


$$v(h)=1.62 h^{0.409}$$



## 4. BIOECONOMIC MODEL ( 11 )

9. More relevant to the PPR study area, Belcher et al. (2001) estimated the **benefits of wetlands retention** in Saskatchewan. From this literature, we find that wetlands range in **value** between **\$39.62** (based on Belcher et al.) and **\$338** per **hectare** (based on Woodward and Wui).
10. Notice that benefits are measured in hectares, while the measure for wetlands used in this study is ponds. If we assume an **exponential** distribution of pond sizes, we can calculate the average **pond** to be **0.27 ha**.



## 4. BIOECONOMIC MODEL ( 12 )

11. Upon adjusting the above values for an **average pond** size in the PPR, we find that the **marginal value** of a pond ranges between **\$11 and \$91**. The lower value is from Belcher et al. (2001), which is used in this study as it is based on a similar region.

## 4. BIOECONOMIC MODEL ( 13 )

12. The cost of retaining wetlands is a **net opportunity cost**. We obtain estimates of the annual private net opportunity cost of retaining wetlands from Cortus et al. (2010), who use a **farm-level** simulation model to determine the net private costs of retaining wetlands in the PPR. They measure the net annual opportunity cost to be between **\$8** to **\$11** per pond.

## 4. BIOECONOMIC MODEL ( 14 )

13. One-time **cost of restoring wetlands**. Hansen (2009) estimates the costs of restoring wetlands in the prairie pothole area, and finds that costs range between **\$360** and **\$1300** per pond. However, these costs are **one-time costs**, and need to be converted to an **annual basis**. Suppose that the authority purchases a **30-year** easement on the larger property. In that case, the annualized restoration cost would be **\$12** to **\$44** per pond.
14. We find that annual costs range broadly from **\$20 to \$55** per pond. We conservatively assume a baseline cost of **\$55**.

U.S. experiences

## 4. BIOECONOMIC MODEL ( 15 )

15. A **logistic production** (growth) function of the following form is estimated for ducks:

$$g(D_t, W_t) = \eta D_t \left( 1 - \frac{D_t}{gW_t^b} \right)$$

The rate at which a population increases in size if there are no density-dependent forces regulating the population

Where

$gW_t^b$ : **carrying capacity** of the prairie pothole ecosystem  
 $\eta$  : **intrinsic growth rate**.

We have data on breeding ducks and immature offspring, and on wetlands (May pond counts), for the PPR(strata 26 through 40) over the period 1955 to 2007.



## 4. BIOECONOMIC MODEL ( 16 )

16. We use the data to estimate Eq. (11) using **non-linear least squares**:

$$g(D_t, W_t) = 2.89D \left( 1 - \frac{D}{12.29W^{0.91}} \right) \quad R^2=0.50, S.E=7.79 \quad (12)$$

The predicted change in **wetlands** under different **climate scenarios** works through the **carrying capacity** of the logistics function.

**COMMENT:**  
**No statistical significance**  
**of the regressors**



# 4. BIOECONOMIC MODEL ( 17 )

author calculation

Hammack and  
Brown's(1976)

$$v(h)=114.58h^{0.4}$$

Item	Case parameter values
Marginal hunter benefit function	$\partial g/\partial h=46.8 h^{-0.6}$
Marginal product of wetlands in duck production	$\partial g/\partial W=0.214D^2W^{-1.91}$
Marginal product of breeding ducks	$\partial g/\partial D=2.89-0.470DW^{-0.91}$
Intra-year duck survival rates	$s_1=0.95, s_2=0.80$
Marginal cost of protecting wetlands	$c=C'(W)=\$ 55$
Marginal amenity value of wetlands	$B'(W)=\$11$
Marginal non-hunting value of a duck	$\alpha =\$1$
Adjustment for underreporting of kills	$\pi =1.05$

Lommis and  
White(1996)

Brown(1976)

$$g(D_t, W_t) = 2.89D \left( 1 - \frac{D}{12.29W^{0.91}} \right)$$

## 5. RESULTS FOR VARIOUS CLIMATE

Larson(1995), Sorenson et al.(1998), Johnson et al(2005),

### 5.1 Climate Change and the Impact on Wetlands

1. The **climate scenarios** are listed as followed:

- (1) an increase in temperature of **3 °C**, **no change** in precipitation;
- (2) **no increase in** temperature, a **decrease** in precipitation of **20%**;
- (3) an increase in temperature of **3 °C**, a **decrease** in precipitation of **20%**;
- (4) an increase in temperature of **3 °C**, an **increase** in precipitation of **20%**.

# 5. RESULTS FOR VARIOUS CLIMATE SCENARIOS ( 2 )

**+3 °C temperature > -20% precipitation**

**Precipitation -20% > +20%**

Table 2 Effect of climate scenarios on wetlands: percent decrease in wetlands.

Regression model	Scenarios			
	+3 °C temperature	-20% precipitation	+3 °C and -20% precipitation	+3 °C and +20% precipitation
$W = 2.9 + 3.33SP_{t-1}$	-20%	-13%	-34%	-7%
$W = 3.138 + 0.0085P_{t-1} - 0.31T_{t-1}$	-27%	-19%	-47%	-10%

**multiple regression > simple regression**

**The same**

**+20% precipitation, wetland still decrease (-)**



# 5. RESULTS FOR VARIOUS CLIMATE SCENARIOS ( 3 )

## 5.2 Effect of Climate Change on Optimal Wetlands

average of 1955–2008 data (U.S. Fish and Wildlife Service) <http://mbdcapps.fws.gov/>

	Ponds (W)	Ducks (D)	Harvests (h)
Historic	3.5	13.5	12.4
Base case	4.1	20.3	19.6

Bioeconomic model,  
no climate change

Base case > Historic  
Wetland benefit consideration

# 5. RESULTS FOR VARIOUS CLIMATE SCENARIOS ( 4 )

$$(4.1-3.2)/4.1=22\%$$

regression Eqs. (3) or (4)

Regression model	Base case	Scenario i		Scenario ii		Scenario iii		Scenario iv	
		(3)	(4)	(3)	(4)	(3)	(4)	(3)	(4)
Ponds (W)	4.1	3.4	3.2	3.7	3.5	3.0	2.6	3.9	3.8
Ducks (D)	20.3	13.8	11.8	15.9	14.1	9.9	6.85	17.9	16.9
Harvest (h)	19.6	13.4	11.5	15.4	13.7	9.7	6.75	17.3	16.4

$$(19.6-11.5)/19.6=41\%$$

$$(20.3-11.8)/20.3=42\%$$

**Climate change : Ducks (D) > Ponds (W)**



## 6. CONCLUSIONS

+3 °C and –20%  
precipitation

1. **Climate change** regression : the worst case, wetland decreased as much as **47%**.
2. **Bioeconomic** model: the worst case, wetland decrease **38%**→**duck** reduce **66%**.
3. Policy suggestions:
  - (1) Encourage **landowner** to conserve wetland rather than agriculture activity
  - (2) Charge **American** hunters
  - (3) Hunting regime **management**
  - (4) Develop **sustainable** carbon sequestration tech

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*Thank you  
for your attentions!!*

# Standardized Precipitation Index (SPI)

1. SPI is an **probability index** which only consider the **precipitation** to estimate **drought** condition.
2. **median** : The probabilities are **standardized** so that an index of **zero** indicates the **median** precipitation amount.
3. The index is **negative(-)** for **drought**, and **positive(+)** for **wet** conditions.
4. SPI could be applied in both **short-term** (1 month) and **long-term** (2 years) drought.





# Palmer Drought Index (PDI)

1. Developed by **Palmer** (1965).
2. Use **temperature** and **rainfall** information to determine dryness.
3. PDI has the best performance in **long term drought** (several months), not good in short term (weeks).
4. PDI is **standardized** to local climate to be **comparable** in different locations.



# Palmer Drought Index (PDI)

- PDI classification

PDI	Class
$\geq 4$	Extremely wet
3.00 ~ 3.99	Very wet
2.00 ~ 2.99	Moderately wet
1.00 ~ 1.99	Slightly wet
0.50 ~ 0.99	Incipient wet spell
0.49 ~ -0.49	Near normal
-0.50 ~ -0.99	Incipient dry spell
-1.00 ~ -1.99	Mild drought
-2.00 ~ -2.99	Moderate drought
-3.00 ~ -3.99	Severe drought
$\leq -4$	Extreme drought

PDI= - 1.2

PDI= - 3.4



# Wetland Simulation Model (WETSIM)

1. Developed by **Poiani and Johnson** (1991).
2. A **deterministic** model based on **watershed** and **wetland hydrological processes**.
3. Use **daily precipitation** and **temperature** to simulate wetland **water balance** and **vegetation**.
4. The cell size was **5m × 5m**.
5. This model was calibrated and validated by the **field data in PPR**.



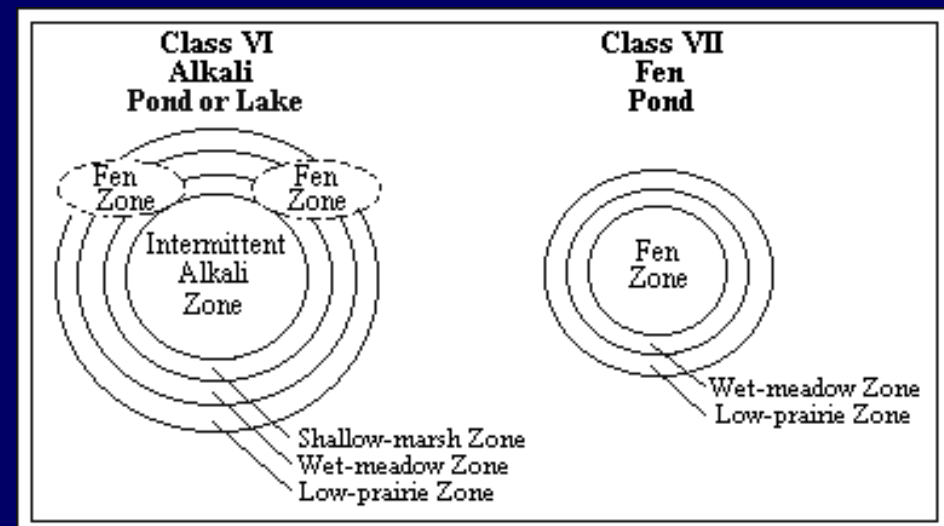
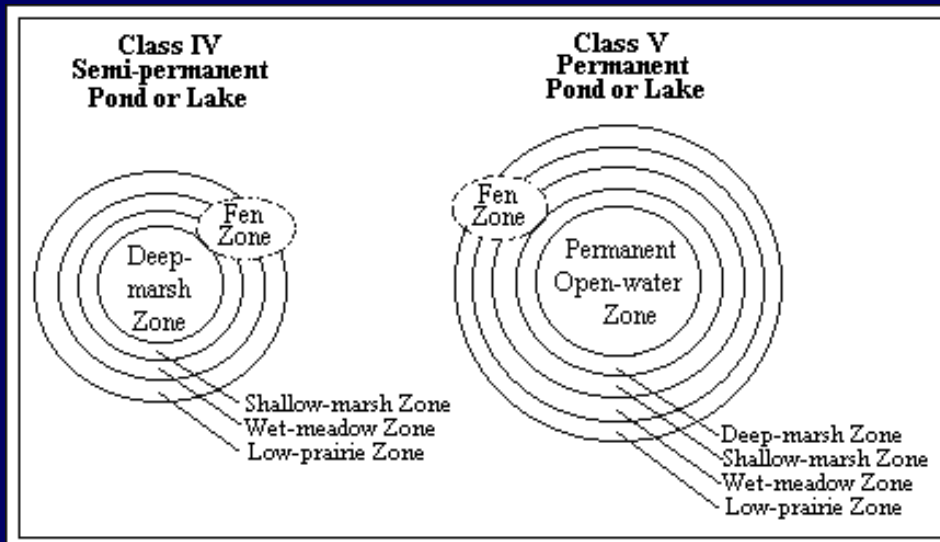
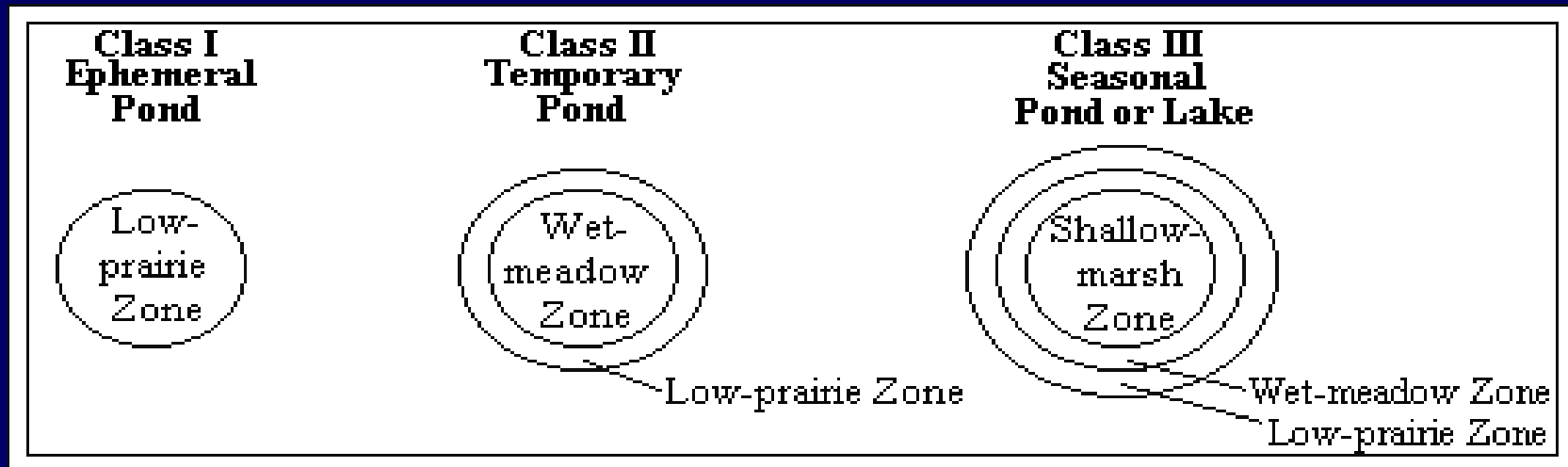
# Wetland Classification in the Glaciated Prairie Region

- Classification was based on the vegetation zone in the central or deeper part

Class	description
ephemeral ponds	Central zone represented by low-prairie vegetation
temporary ponds	Central zone represented by wet-meadow vegetation
seasonal ponds	Central zone represented by shallow-marsh vegetation
semipermanent ponds	Central zone represented by deep-marsh vegetation
permanent ponds	Central area represented by permanent-open-water zone
alkali ponds	Central area represented by intermittent-alkali zone
fen ponds	Central zone represented by fen vegetation



# Wetland Classification in the Glaciated Prairie Region



# Bellman equation

- **Dynamic programming: simplify** a complicated problem to sub-problems. Then combine the solutions of the sub-problems to reach an **overall solution**.
- **Bellman equation**: When the problem is difficult to **separate**, we can use a **time** sequence “**value function**”  $V_t(y)$  to present the value at  $t$  in the state of  $y$ . That **recursive relationship** called the “Bellman equation”.
- **Bellman principle of optimality**: An optimal policy has the property that whatever the **initial state** and **initial decision** are, the remaining decisions must constitute an **optimal** policy with regard to the state resulting from the **first decision**.



# Lagrange multiplier method

A strategy for finding  
to constraints.

maximize  $f(x, y)$   
subject to  $p(x, y) =$

$$v(h_t, y_t, z_t) + \alpha D_t + B(W) - C(W)$$

$$D_{t+1} = s_2 [s_1 D_t + g(D_t, W_t) - \pi h_t]$$

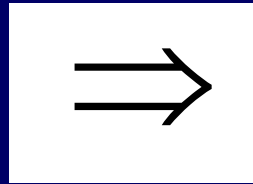
$$V_t(h_t, D_t, W_t, \lambda_{t+1}) = [v(h_t, y_t, Z_t) + \alpha D_t + B(W_t) - C(W_t)] + \rho \lambda_{t+1} (D_{t+1})$$

$$\wedge(x, y, \lambda) = f(x, y) + \lambda \cdot (p(x, y) - c)$$

To get the **maximum**, set the first derivative of the function =0

$$\frac{\partial \wedge}{\partial x} = 0, \quad \frac{\partial \wedge}{\partial y} = 0, \quad \frac{\partial \wedge}{\partial p} = \lambda$$





$$\frac{\partial r_t}{\partial h_t} = \frac{\partial V}{\partial h_t} - \rho \lambda_{t+1} S_2 \pi = 0 \dots\dots\dots(9a)$$

$$\lambda_{t+1} = \frac{1}{\rho S_2} \frac{1}{\pi} \frac{\partial V}{\partial h_t} \dots\dots\dots(9a')$$

$$\frac{\partial V_t}{\partial W_t} = B'(W_t) - C + \rho \lambda_{t+1} S_2 \frac{\partial g}{\partial W_t} = 0 \dots\dots\dots(9b)$$

解聯立方程式

將 (9a') 帶入(9b)

$$B'(W_t) - C + \frac{1}{\pi} \frac{\partial V}{\partial h_t} \frac{\partial g}{\partial W_t} = 0$$

$$B'(W_t) + \frac{1}{\pi} \frac{\partial V}{\partial h_t} \frac{\partial g}{\partial W_t} = C \dots\dots\dots(10a)$$



$$\left\{ \begin{array}{l} \lambda_{t+1} = \frac{1}{\rho S_2} \frac{1}{\pi} \frac{\partial V}{\partial h_t} \dots\dots\dots (9a') \\ \frac{\partial V_t}{\partial D_t} = \lambda_t = \alpha + \rho \lambda_{t+1} S_2 (S_1 + \frac{\partial g}{\partial D_t}) \dots\dots\dots (9c) \end{array} \right.$$

將  $\lambda_{t+1} = \lambda_t$  帶入(9a')及(9c)

$$\left\{ \begin{array}{l} \lambda_t = \frac{1}{\rho S_2} \frac{1}{\pi} \frac{\partial V}{\partial h_t} \\ \lambda_t = \alpha + \rho \lambda_t \left[ S_1 S_2 + S_2 \frac{\partial g}{\partial D_t} \right] \end{array} \right. \Rightarrow 0 = \alpha + \frac{1}{\pi S_2} \frac{\partial V}{\partial h_t} \left[ S_1 S_2 + S_2 \frac{\partial g}{\partial D_t} - \frac{1}{\rho} \right]$$

$$\because \rho = \frac{1}{1+r} \Rightarrow \frac{1}{\rho} = 1+r$$

解聯立方程式

$$0 = \frac{\pi S_2 \partial h_t}{\partial V} \alpha + S_1 S_2 + S_2 \frac{\partial g}{\partial D_t} - 1 - r$$

$$S_1 S_2 + S_2 \frac{\partial g}{\partial D_t} - 1 + \frac{\pi S_2}{\partial V / \partial h_t} \alpha = r \dots\dots\dots (10b)$$

$$D_{t+1} = s_2 [s_1 D_t + g(D_t, W_t) - \pi h_t] \dots\dots\dots(6)$$

$$D = S_2 [S_1 D + g(D, W) - \pi h_t] = S_1 S_2 D + S_2 g(D, W) - S_2 \pi h_t$$

$$(1 - S_1 S_2) D = S_2 g(D, W) - S_2 \pi h_t = S_2 [g(D, W) - \pi h_t]$$

$$(1 - s_1 s_2) D = s_2 g(D, W) - \pi h \dots\dots(10c)$$

COMMENT

$$(1 - s_1 s_2) D = s_2 [g(D, W) - \pi h] \dots\dots(10c-my)$$



# Critical Point Theorem

