Sets

- *C* cows
- *T* time (week)

Data

- P price of the milk from per unit of grass (\$) = 4.2
- R_t units of grass required to feed the herd in week t
- $G(S_t)$ units of grass available next week given S_t the amount at the start of week t
- S_0 units of grass on the field at time initially = 100
- MF maximum units of feed that can be converted into milk across the herd =40

Stages

• Weeks - $0 \le t \le 51$

State

• S_t - pasture at the start of week t

Action

• $A_t = [0, \min(S_t, MF)]$ - extra feed to the herd on week t

Value Function

 $V_t(S_t) = \text{maximum expected income if we start week } t \text{ with } S_t \text{ pasture}$

Base Case

- Insufficient units of pasture to meet the feeding requirement ightarrow Infeasible

$$\forall 0 \leq t \leq 51, \ S_t \leq R_t \rightarrow V_t(S_t) = -\infty$$

• End of the season, compute feed amount for week 51 maximising the profit

$$V_{51} = \max(a \times P, \ \forall a \in A_{51})$$

General Case

ullet explore the action space A_t to find the optimal feeding strategy that maximises the profit

$$V_t(S_t) = \max \bigl(a \times P + V_{t+1}(G(S_t) - a - R_t), \ \forall a \in A_t\bigr)$$

Sets

- *C* cows
- T time (week)

Data

- P price of the milk from per unit of grass (\$) = 4.2
- R_t units of grass required to feed the herd in week t
- $G(S_t)$ units of grass available next week given S_t the amount at the start of week t
- S_0 units of grass on the field at time initially = 100
- MF maximum units of feed that can be converted into milk across the herd =40
- MG minimum units of grass before penalty is applied = 150
- L penalty cost per unit under 150 (\$) = 5

Stages

• Weeks - $0 \le t \le 51$

State

• S_t - pasture at the start of week t

Action

• $A_t = [0, \min(S_t, MF)]$ - extra feed to the herd on week t

Value Function

 $V_t(S_t) = \text{maximum expected income if we start week } t \text{ with } S_t \text{ pasture}$

Base Case

• Insufficient units of pasture to meet the feeding requirement \rightarrow Infeasible

$$\forall 0 \le t \le 51, \ S_t \le R_t \to V_t(S_t) = -\infty$$

• End of the season, compute feed amount for week 51 maximising the profit taking penalty for each unit under 150 into consideration

$$V_{51} = \max(a \times P - L \times (G(S_{51}) - a - R_{51}), \ \forall a \in A_{51})$$

General Case

 \bullet explore the action space A_t to find the optimal feeding strategy that maximises the profit

$$V_t(S_t) = \max(a \times P + V_{t+1}(G(S_t) - a - R_t), \ \forall a \in A_t)$$

Sets

- *C* cows
- T time (week)

Data

- P price of the milk from per unit of grass (\$) = 4.2
- R_t units of grass required to feed the herd in week t
- $G(S_t, \text{good})$ units of grass available next week if the weather is good, given S_t pasture at the start of week t
- $G(S_t, \text{bad})$ units of grass available next week if the weather is bad, given S_t pasture at the start of week t
- S_0 units of grass on the field at time initially = 100
- MF maximum units of feed that can be converted into milk across the herd =40
- MG minimum units of grass before penalty is applied = 150
- L penalty cost per unit under 150 (\$) = 5
- $P_{
 m good}$ probability of having good weather in the region = 0.5

Stages

• Weeks - $0 \le t \le 51$

State

• S_t - pasture at the start of week t

Action

- $A_t = [0, \min(S_t, \mathrm{MF})]$ - extra feed to the herd on week t

Value Function

 $V_t(S_t) = \text{maximum expected income if we start week } t \text{ with } S_t \text{ pasture}$

Base Case

- Insufficient units of pasture to meet the feeding requirement ightarrow Infeasible

$$\forall 0 \le t \le 51, \ S_t \le R_t \to V_t(S_t) = -\infty$$

• End of the season, compute feed amount for week 51 maximising the profit, and apply penalty for each unit under 150 taking both good and bad weather into consideration

$$V_{51}(S_{51}) = \max \left(a \times P - L \times \left(P_{\text{good}} \times (G(S_{51}, \text{good}) - a - R_{51}) + \left(1 - P_{\text{good}}\right) \times (G(S_{51}, \text{bad}) - a - R_{51})\right), \ \forall a \in A_{51}\right)\right)$$

General Case

- explore the action space A_t to find the optimal feeding strategy that maximises the profit

$$V_t(S_t) = \max \left(a \times P + P_{\text{good}} \times V_{t+1}(G(S_t, \text{good}) - a - R_t) + \left(1 - P_{\text{good}}\right) \times V_{t+1}(G(S_t, \text{bad}) - a - R_t), \ \forall a \in A_t\right)$$

Sets

- *C* cows
- T time (week)

Data

- P price of the milk from per unit of grass (\$) = 4.2
- R_t units of grass required to feed the herd in week t
- $G(S_t, \text{good})$ units of grass available next week if the weather is good, given S_t pasture at the start of week t
- $G(S_t, \text{bad})$ units of grass available next week if the weather is bad, given S_t pasture at the start of week t
- S_0 units of grass on the field at time initially = 100
- MF maximum units of feed that can be converted into milk across the herd = $10 \times (4-d)$
- MG minimum units of grass before penalty is applied = 150
- L penalty cost per unit under 150 (\$) = 5
- P_{good} probability of having good weather in the region = 0.5
- DRF dry reduced feed in units of grass = 3

Stages

• Weeks - $0 \le t \le 51$

State

- S_t pasture at the start of week t
- d number of dried cows

Action

- $A_t = [0, \min(S_t, MF)]$ extra feed to the herd on week t
- $D = \{d, d + 1\}$ dry a cow or not

Value Function

 $V_t(S_t, d) = \text{maximum expected income if we start week } t \text{ with } S_t \text{ pasture and } d \text{ cows dried}$

Base Case

- In sufficient units of pasture to meet the feeding requirement \rightarrow Infeasible

$$\forall 0 \le t \le 51, \ S_t \le R_t - d \times \text{DRF} \to V_t(S_t, d) = -\infty$$

- End of the season, apply penalty for each unit under 150
 - All cows dried \rightarrow deterministic

$$\begin{array}{l} V_{51}(S_{51},4) = -L \times \left(P_{\rm good} \times (G(S_{51}, \rm good) - R_{51} + 4 \times \rm DRF) + \left(1 - P_{\rm good}\right) \times \left(G(S_{51}, \rm bad)\right) - R_{51} + 4 \times \rm DRF) \end{array}$$

• otherwise \rightarrow compute feed amount for week 51 taking penalty into consideration to maximise the profit

$$\begin{split} V_{51}(S_{51},d) &= \max \left(a \times P - L \times \left(P_{\text{good}} \times (G(S_{51}, \text{good}) - a - R_{51} + d \times \text{DRF}) + \left(1 - P_{\text{good}}\right) \times \left(G(S_{51}, \text{bad}) - a - R_{51} + d \times \text{DRF}\right)\right), \ \forall a \in A_{51}\right)) \end{split}$$

General Case

• All cows dried \rightarrow deterministic, compute to end of the season $V_t(S_t,4) = P_{\mathrm{good}} \times V_{t+1}(G(S_t,\mathrm{good}) - a - R_t - 4 \times \mathrm{DRF}) + \left(1 - P_{\mathrm{good}}\right) \times V_{t+1}(G(S_t,\mathrm{good}) - a - R_t - 4 \times \mathrm{DRF}) + \left(1 - P_{\mathrm{good}}\right) \times V_{t+1}(G(S_t,\mathrm{good}) - a - R_t - 4 \times \mathrm{DRF}) + \left(1 - P_{\mathrm{good}}\right) \times V_{t+1}(G(S_t,\mathrm{good}) - a - R_t - 4 \times \mathrm{DRF})$

$$V_{t+1}(G(S_t, \operatorname{pad}) - a - R_t - 4 \times \operatorname{DRF})$$

• otherwise \rightarrow explore the action space $D \times A_t$ - (dry a cow?) \times (different amount of extra feed) to find the optimal strategy that maximises the profit

$$\begin{split} V_t(S_t, d) &= \max \left(a \times P + P_{\text{good}} \times V_{t+1}(G(S_t, \text{good}) - a - R_t - d \times \text{DRF}, d') + \left(1 - P_{\text{good}} \right) \times \\ V_{t+1}(G(S_t, \text{bad}) - a - R_t - d \times \text{DRF}, d'), \ \forall a \in A_t, \ \forall d' \in D \end{split}$$

Sets

- *C* cows
- T time (week)

Data

- P price of the milk from per unit of grass (\$) = 4.2
- $G(S_t, \text{good})$ units of grass available next week if the weather is good, given S_t pasture at the start of week t
- $G(S_t, \text{bad})$ units of grass available next week if the weather is bad, given S_t pasture at the start of week t
- S_0 units of grass on the field at time initially = 100
- MF maximum units of feed that can be converted into milk across the herd = $10 \times \sum l$
- MG minimum units of grass before penalty is applied = 150
- L penalty cost per unit under 150 (\$) = 5
- $P_{
 m good}$ probability of having good weather in the region = 0.5
- $R_t(l_t)$ units of grass required to feed each cow in week t given lactating tuple l_t
- $l_0 = (1, 1, 1, 1)$
- $l_{\text{dried}} = (0, 0, 0, 0)$

Stages

• Weeks - $0 \le t \le 51$

State

- S_t pasture at the start of week t
- l_t 4D tuple, specify which cows are still lactating in week t

Action

- $A_t = [0, \min(S_t, MF)]$ extra feed to the herd on week t
- D_c dry cow c if c is still lactating

Value Function

 $V_t(S_t, l_t) = \text{maximum}$ expected income if we start week t with S_t pasture and lactating pattern l_t

Base Case

- Insufficient units of pasture to meet the feeding requirement \to Infeasible $\forall 0 \leq t \leq 51, \ S_t \leq R_t(l_t) \to V_t(S_t, l_t) = -\infty$
- End of the season, apply penalty for each unit under 150

- All cows dried \rightarrow deterministic $V_{51}(S_{51}, l_{\text{dried}}) = -L \times \left(P_{\text{good}} \times (G(S_{51}, \text{good}) - R_{51}(l_{\text{dried}})) + \left(1 - P_{\text{good}}\right) \times \left(G(S_{51}, \text{bad})\right) - R_{51}(l_{\text{dried}})\right)$

• otherwise \rightarrow compute feed amount for week 51 taking penalty into consideration to maximise the profit

$$\begin{array}{l} V_{51}(S_{51},l_{51}) = \max \left(a \times P - L \times \left(P_{\text{good}} \times (G(S_{51},\text{good}) - a - R_{51}(l_{51})) + \left(1 - P_{\text{good}} \right) \times (G(S_{51},\text{bad}) - a - R_{51}(l_{51})) \right), \ \forall a \in A_{51} \right) \end{array}$$

General Case

- All cows dried \rightarrow deterministic, compute to end of the season $V_t(S_t, l_{\text{dried}}) = P_{\text{good}} \times V_{t+1}(G(S_t, \text{good}) a R_t(l_{\text{dried}}), \ l_{\text{dried}}) + \left(1 P_{\text{good}}\right) \times V_{t+1}(G(S_t, \text{bad}) a R_t(l_{\text{dried}}), \ l_{\text{dried}})$
- otherwise \rightarrow explore the action space $D_c \times A_t$ (drying cow c) \times (different amount of extra feed) to find the optimal strategy that maximises the profit $V_t(S_t, l_t) = \max \left(a \times P + P_{\text{good}} \times V_{t+1} \left(G(S_t, \text{good}) a R_t(l_t), l_{t+1} \right) + \left(1 P_{\text{good}} \right) \times V_{t+1} \left(G(S_t, \text{bad}) a R_t(l_t), l_{t+1} \right), \ \forall a \in A_t, \ \forall l_{t+1} \in \{l_t, l_t \text{ with one of the 1s changed to a 0}\}$