



INDIAN INSTITUTE OF SCIENCE

Water Resources Systems: **Modeling Techniques and Analysis**

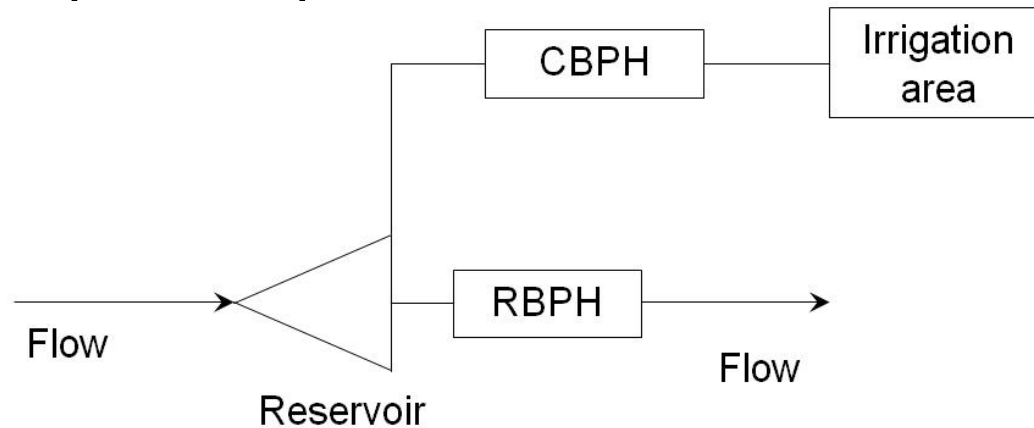
Lecture - 39

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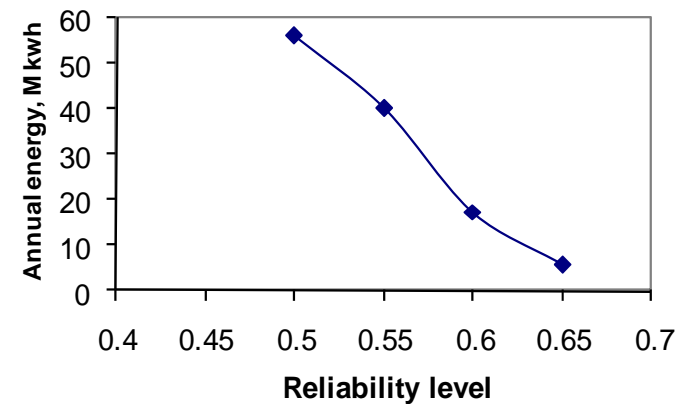
Summary of the previous lecture

Hydro power optimization:



CBPH: Canal Bed Powerhouse

RBPH: Riverbed Powerhouse



CROP YIELD OPTIMIZATION

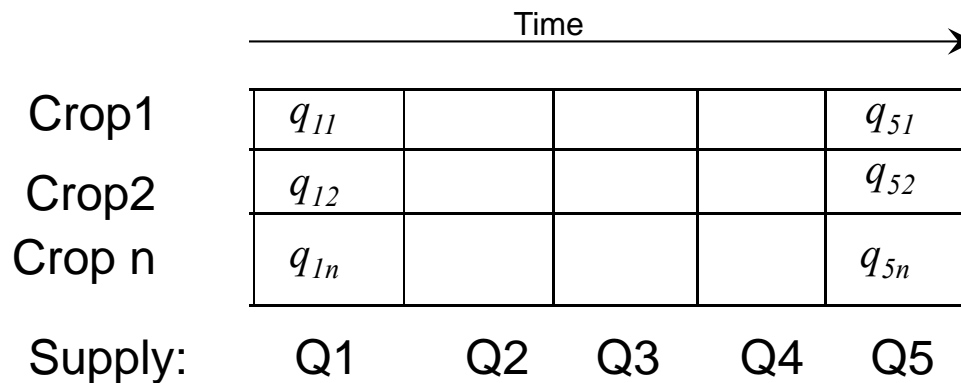
Crop Yield Optimization

- The objective of an irrigation water management problem is to maximise the crop production, taking into account the response of the crop to the amount of irrigation applied.
- Typical crop production functions relate the yield ratio of a crop to a function of the evapotranspiration ratio over the growth stages.

Crop Yield Optimization

- Water allocation among crops

Influencing factors :Crop Areas, Rainfall, Soil Moisture, Irrigation Supply, Time of the year, PET, Crop sensitivity to deficit supply, Competition among crops for water.



Optimal allocation of a known quantity of water to maximize crop yield

Crop Yield Optimization

Crop production function

- System performance measure
- Response of the crop yield to water supply during intraseasonal periods.
- A function of evapotranspiration deficits occurring during the growth stages of the crop.

K_y: Crop yield factor

$$\left(\frac{y}{y_m}\right)_c = \prod_{s=1}^{NS} \left[1 - \underline{\underline{ky_s^c}} \left(1 - \frac{ET_a^c}{ET_{max}^c} \right)_s \right] \dots \text{Multiplicative production function}$$

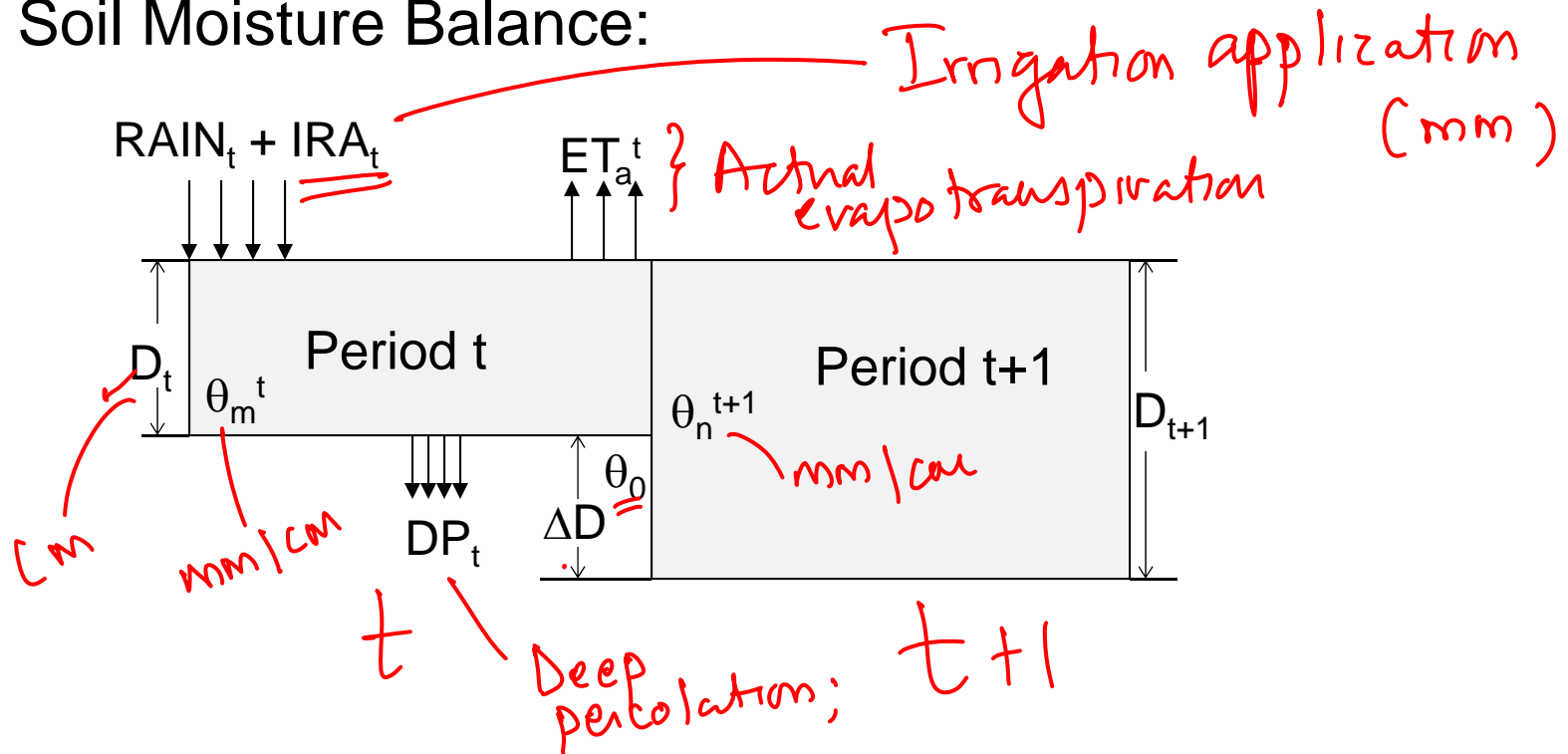
s=1	s=2	s=3	s=4	s=5
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—————> Crop Season

1. Establishment
2. Vegetative
3. Flowering
4. Yield Formation
5. Ripening

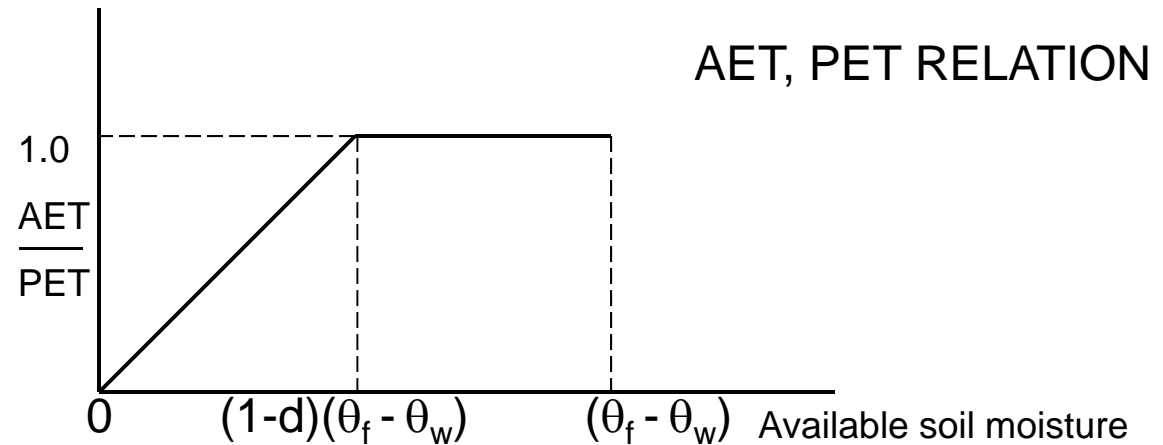
Crop Yield Optimization

Soil Moisture Balance:



$$\theta_n^{t+1} D_{t+1} = \theta_m^t D_t + \text{RAIN}_t + \text{IRA}_t - \text{Et}_a^t - \text{DP}_t + \theta_0 \Delta D$$

Crop Yield Optimization



$$\begin{aligned}
 \text{AET} &= \text{PET} && \text{if } \theta_{\text{avail}} \geq (1-d)(\theta_f - \theta_w) \\
 &= \frac{\theta_{\text{avail}} \text{ PET}}{(1-d)(\theta_f - \theta_w)} && \text{Otherwise}
 \end{aligned}$$

$$\theta_{\text{avail}} = \theta_j + q_j + R_j - \theta_w$$

θ_{avail} = Available Soil Moisture

θ_f = Field Capacity

θ_w = Wilting Point

d = Depletion Factor

θ_j = Soil Moisture

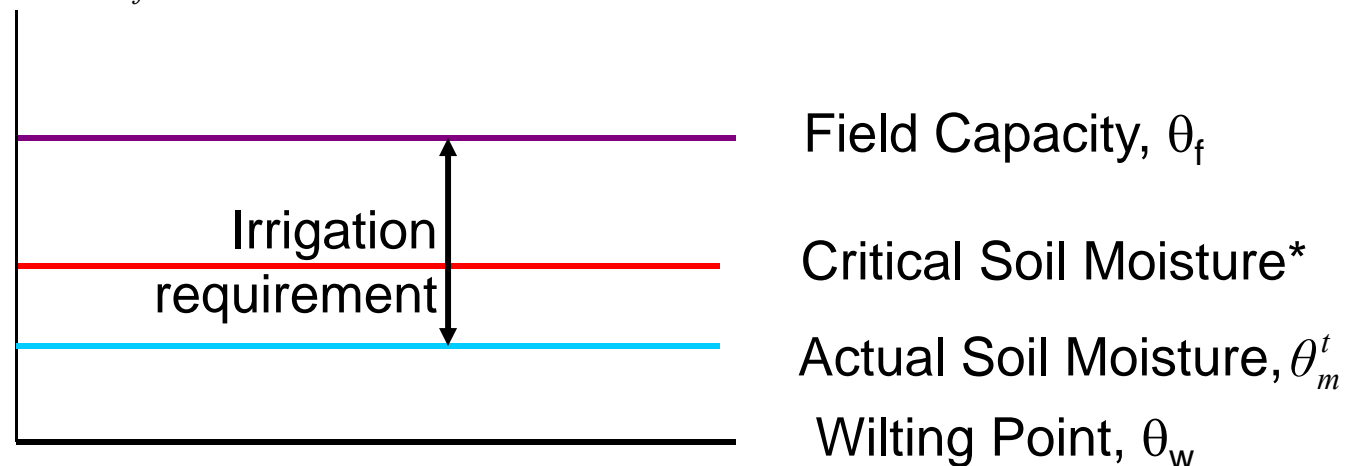
q_j = Irrigation Applied

R_j = Rainfall

Crop Yield Optimization

$$IRR_{c,m}^t = 0 \quad \text{if } (\theta_m^t - \theta_w) D_c^t + RAIN_t \geq (1-d)(\theta_f - \theta_w) D_c^t$$

$$= [\theta_f D_c^t - (\theta_m^t D_c^t + RAIN_t)] A_c \quad \text{otherwise}$$



Irrigation Requirement in period t : Amount of water required to raise the soil moisture to field capacity, when soil moisture is below a critical level.

* Critical Soil Moisture : $(1-d)(\theta_f - \theta_w)$

Crop Yield Optimization

$$\left[\frac{y}{y_m} \right] = 1 - \sum_{g=1}^{N_g} \left[Ky_g \left(1 - \frac{AET}{PET} \right)_g \right] \quad \dots \text{Additive production function}$$

N_g : number of growth stages in the crop season.

g : growth stage index

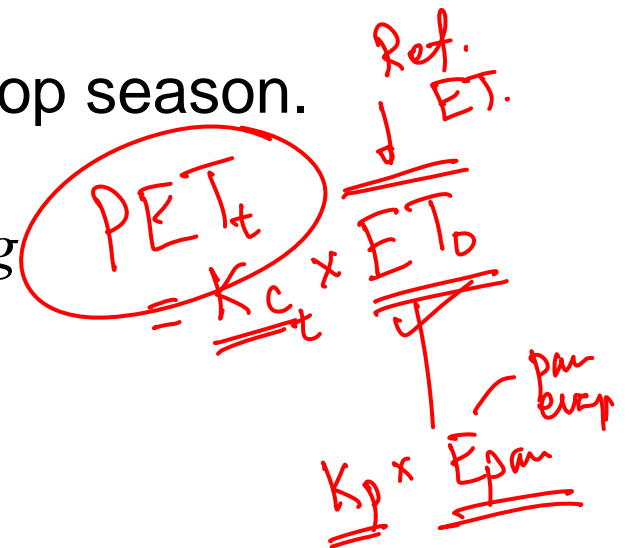
Ky_g : yield factor for the growth stage g

y : actual yield of the crop

y_{max} : maximum yield of the crop

AET : actual evapotranspiration, and

PET : potential evapotranspiration



The yield factor, Ky_g indicates the sensitivity of the crop yield to the evapotranspiration deficit in growth stage g

Crop Yield Optimization

- The soil moisture balance is written for a crop c as

$$\theta_c^{t+1} D_c^{t+1} = \theta_c^t D_c^t + \text{RAIN}^t + \underbrace{q_c^t}_{\text{Irr. APP. mm}} - AET_c^t + \underbrace{\theta_0 (D_c^{t+1} - D_c^t)}_{\theta : \text{mm/cm}} - \underbrace{DP_c^t}_{\text{mm}}$$

where θ_c is the soil moisture of crop c at the beginning of the period t ,

D_c^t is the root depth of crop c during period t ,

RAIN^t is the effective rainfall (contribution of rainfall to soil moisture) in the command area in period t ,

q_c^t is the irrigation application to crop c in period t ,

AET_c^t is the actual evapotranspiration of crop c in period t ,

θ_0 is the initial soil moisture in the soil zone into which the crop root extends at the beginning of period $t+1$, and

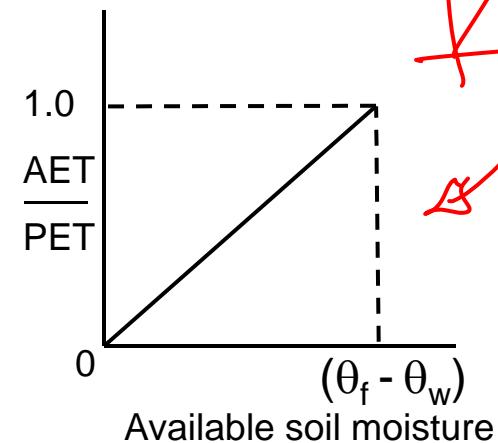
DP_c^t is the deep percolation

Crop Yield Optimization

- The relationship between AET/PET ratio and the available soil moisture is approximated by a linear relationship, with $AET = 0$, when the available soil moisture is zero and $AET = PET$ when the available soil moisture is equal to the maximum available soil moisture.
- θ_f and θ_w are soil moistures at field capacity and wilting point respectively.

$$AET_c^t \leq \frac{(\theta_c^t D_c^t + RAIN^t + q_c^t) - \theta_w D_c^t}{(\theta_f - \theta_w) D_c^t} \times PET_c^t$$

$$AET_c^t \leq PET_c^t$$



Crop Yield Optimization

$$\text{Max} \sum_{t=1}^T \underline{\underline{Ky^t}} \left(\frac{AET^t}{PET^t} \right)$$

Yield factors

$$\text{s.t. } \theta^{t+1} = \theta^t + \underline{\underline{q^t}} + RAIN^t - AET^t - \underline{\underline{DP^t}} \quad \forall t$$

Constant Root Depth

$$AET^t \leq (\theta^t + q^t + RAIN^t - \theta_w) \times \frac{PET^t}{(\theta_f - \theta_w)} \quad \forall t$$

$$AET^t \leq PET^t \quad \forall t$$

Integer (0,1)

Single Crop;

$$\theta^{t+1} \geq \theta_f \times \beta^t \quad \forall t$$

$$DP^t \leq M \times \beta^t \quad \forall t$$

Known amount of water (Volume)

M: large no.

$$\theta_w \leq \theta^{t+1} \leq \theta_f \quad \forall t$$

$$\sum_{t=1}^T q^t \leq \underline{\underline{Q}}$$

Area.

Crop Yield Optimization

Data:

- Crop type : two seasonal
- Crop period: 6 months
- Crop area: 3902.50 hectares
- Field capacity: 33.2% (3.32 mm/cm)
- Wilting point: 16.5% (1.65 mm/cm)
- Root Depth of the crop : 100 cm

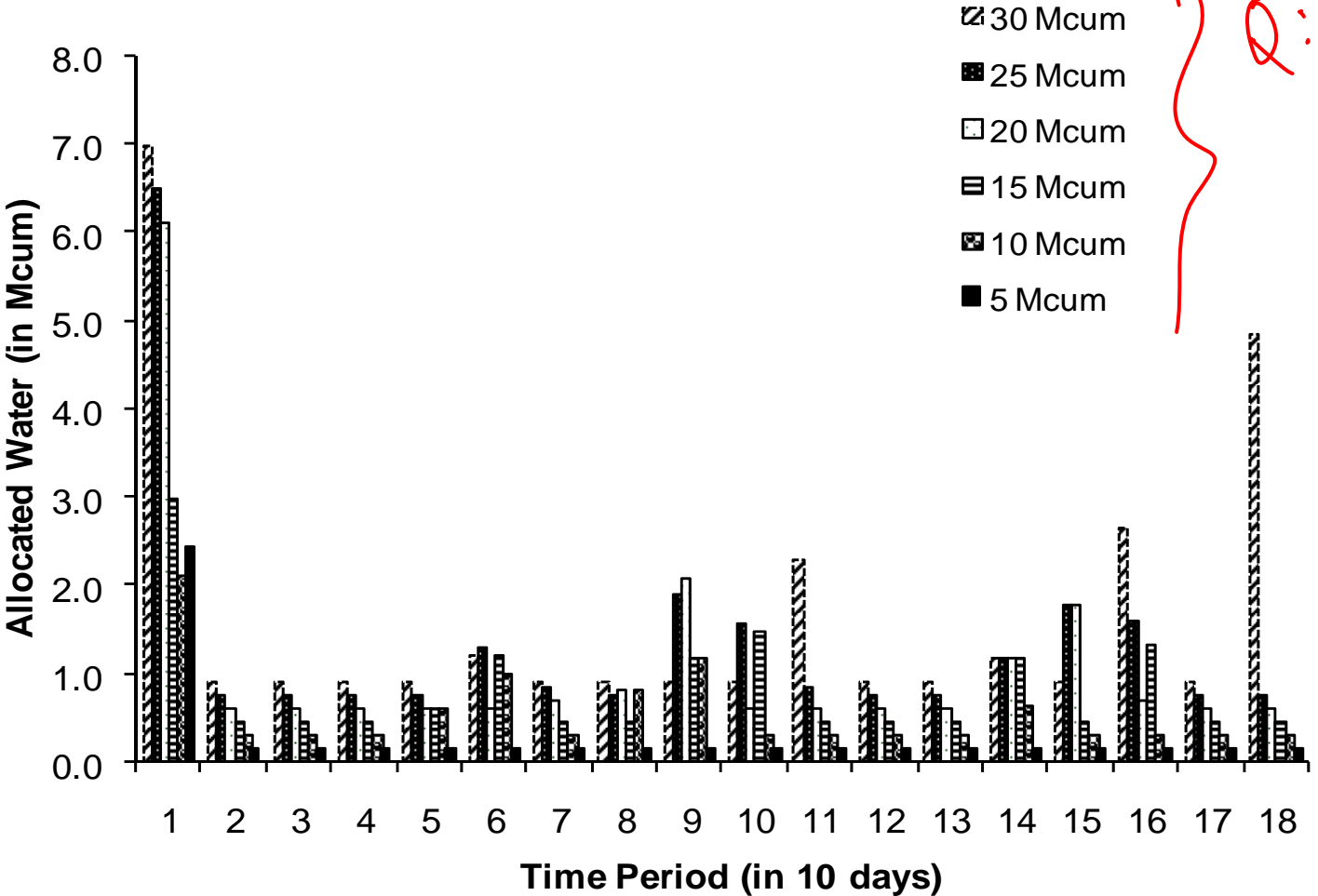
Time periods (10 days)	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18
Rainfall (Rain ^t) in mm	0.5	0.0	0.0	120.0	2.0	2.0	0.0	1.0	0.0	0.0	0.0	1.0	150.0	7.0	3.0	0.0	6.7	0.0

Crop Yield Optimization

Time periods (10 days)	1	2	3	4	5	6	7	8	9	10
PET (mm)	12.32	9.49	11.68	19.06	17.59	35.35	22.20	30.65	37.22	40.65
Ky	0.20	0.20	0.20	0.25	0.25	0.25	0.25	0.25	0.25	0.25

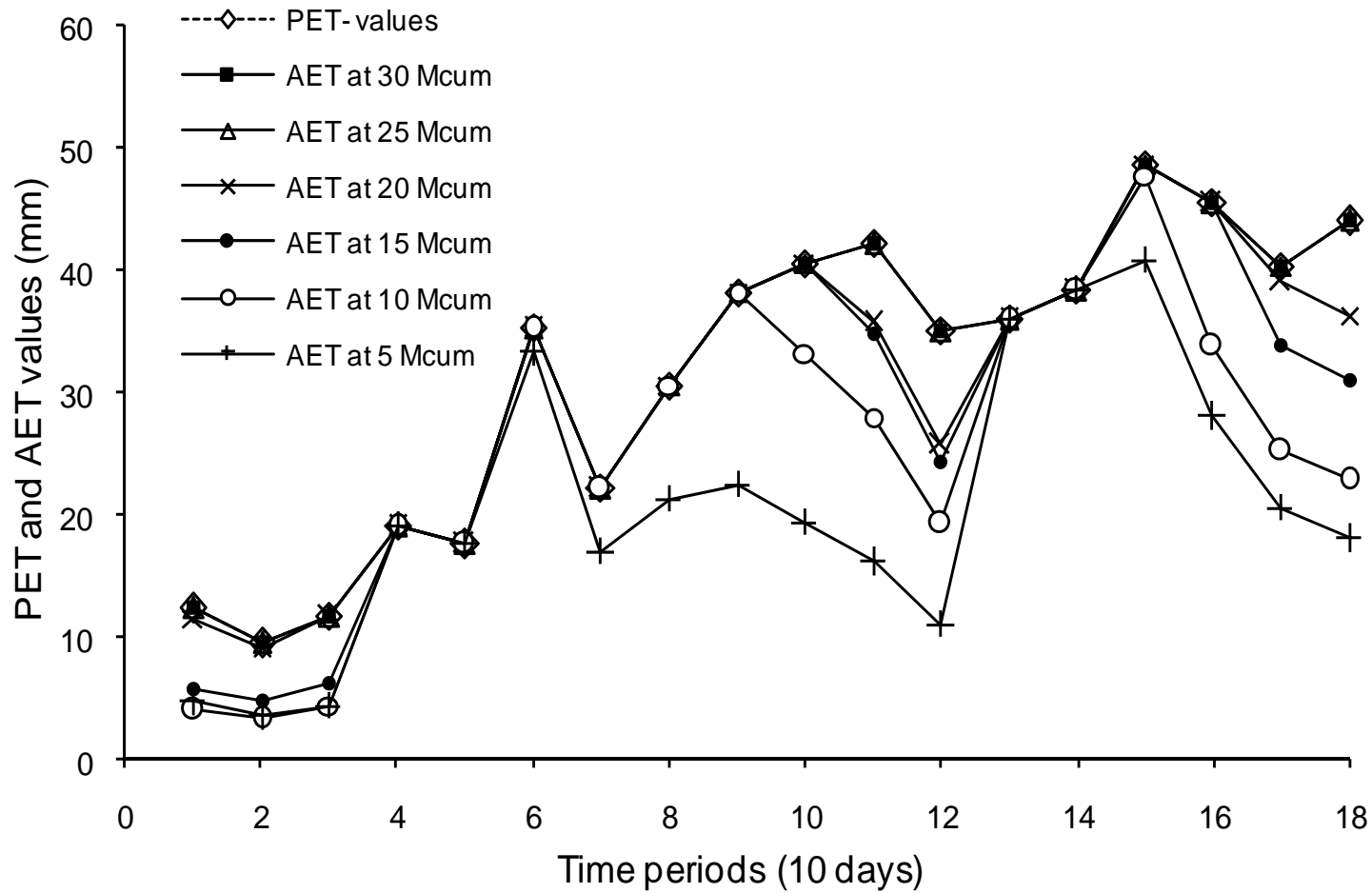
Time periods (10 days)	11	12	13	14	15	16	17	18
PET (mm)	42.19	35.06	36.01	37.42	47.72	45.58	40.4	44.04
Ky	0.25	0.25	0.25	0.25	0.25	0.25	0.25	0.25

Crop Yield Optimization

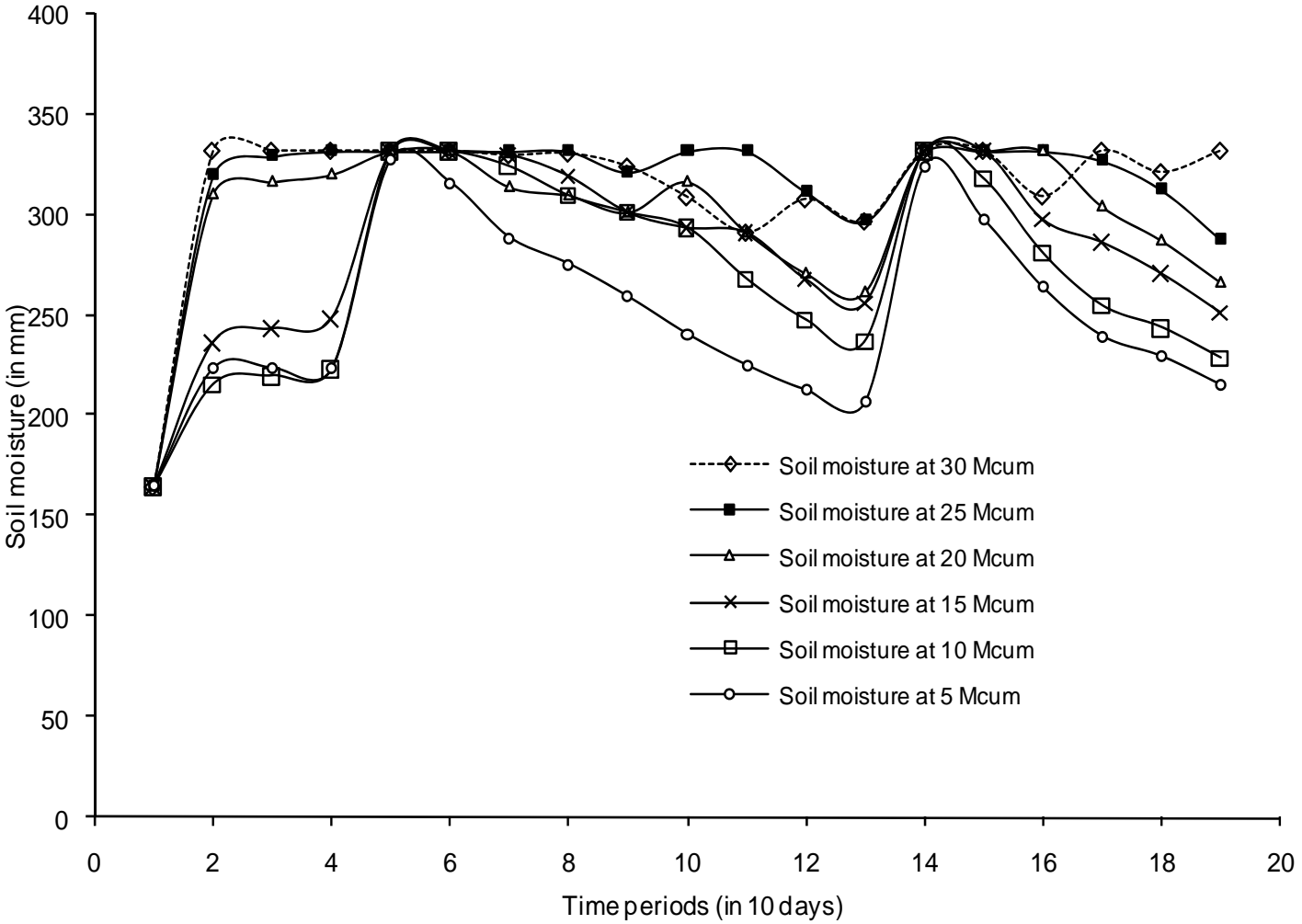


Q: Amount of water available

Crop Yield Optimization



Crop Yield Optimization



Crop Yield Optimization

Variation of yield ratio with amount of available water (Q)

*yield ratio = y/y_m

SI No.	Q (Mm ³)	Yield Ratio*
1	30	1.000
2	25	1.000
3	20	0.823
4	15	0.465
5	10	0.085
6	5	0.0

Crop Yield Optimization

Irrigation water allocation to multiple crops

$$\text{Max} \sum_{c=1}^N \sum_{t=1}^T Ky_c^t \left(\frac{AET_c^t}{PET_c^t} \right)$$

$$\text{s.t. } \theta_c^{t+1} = \theta_c^t + q_c^t + RAIN^t - AET_c^t - DP_c^t \quad \forall c, t$$

$$AET_c^t \leq (\theta_c^t + q_c^t + RAIN_c^t - \theta_w) \times \frac{PET_c^t}{(\theta_f - \theta_w)} \quad \forall c, t$$

$$AET_c^t \leq PET_c^t \quad \forall c, t$$

$$\theta_c^{t+1} \geq \theta_f \times \beta_c^t \quad \forall c, t$$

$$DP_c^t \leq M \times \beta_c^t \quad \forall c, t$$

$$\theta_w \leq \theta_c^{t+1} \leq \theta_f \quad \forall c, t$$

$$\sum_{c=1}^N q_c^t \leq \underline{\underline{Q^t}} \quad \forall t$$

Water available
in period t.

Crop Yield Optimization

- The crop areas are 3902.50 ha (Cotton), 1977.43 ha (Jowar) and 33.10 ha (Groundnut).
- The PET values for these crops are computed from pan evaporation data.
- The problem is to allocate the known amount of water Q^t , in period t , to the three crops, such that the total (relative) crop yield is maximized at the end of the season.
- The amount of water available in a period is a deterministic value, known in advance for all periods t .
- The field capacity is 33.20% and wilting point is 16.50%.
- The root depth is assumed to be 100 cm throughout the season for all crops

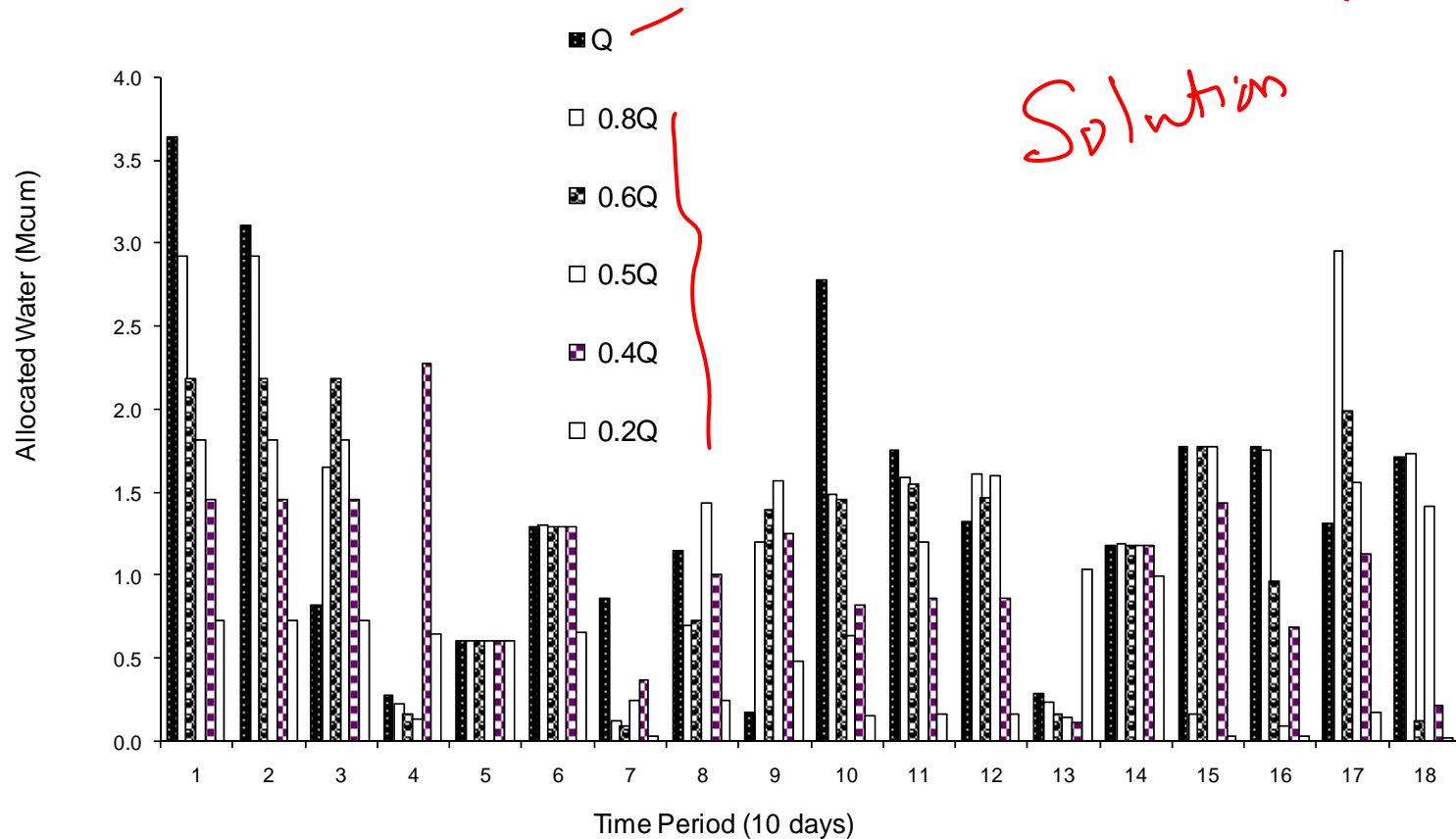
Crop Yield Optimization

Time periods (10 days)	1	2	3	4	5	6	7	8	9
Rainfall (Rain ^t) (mm)	0.5	0.0	0.0	120.0	2.0	2.0	0.0	1.0	0.0
Available irrigation supply (Q ^t) Mcum	3.65	3.65	3.65	5.70	3.70	3.50	3.20	3.20	3.50

Time periods (10 days)	10	11	12	13	14	15	16	17	18
Rainfall (Rain ^t) (mm)	0.0	0.0	1.0	150.0	7.0	3.0	0.0	6.7	0.0
Available irrigation supply (Q ^t) Mcum	<u>3.50</u>	3.70	3.70	5.80	5.60	4.00	4.00	5.00	3.00

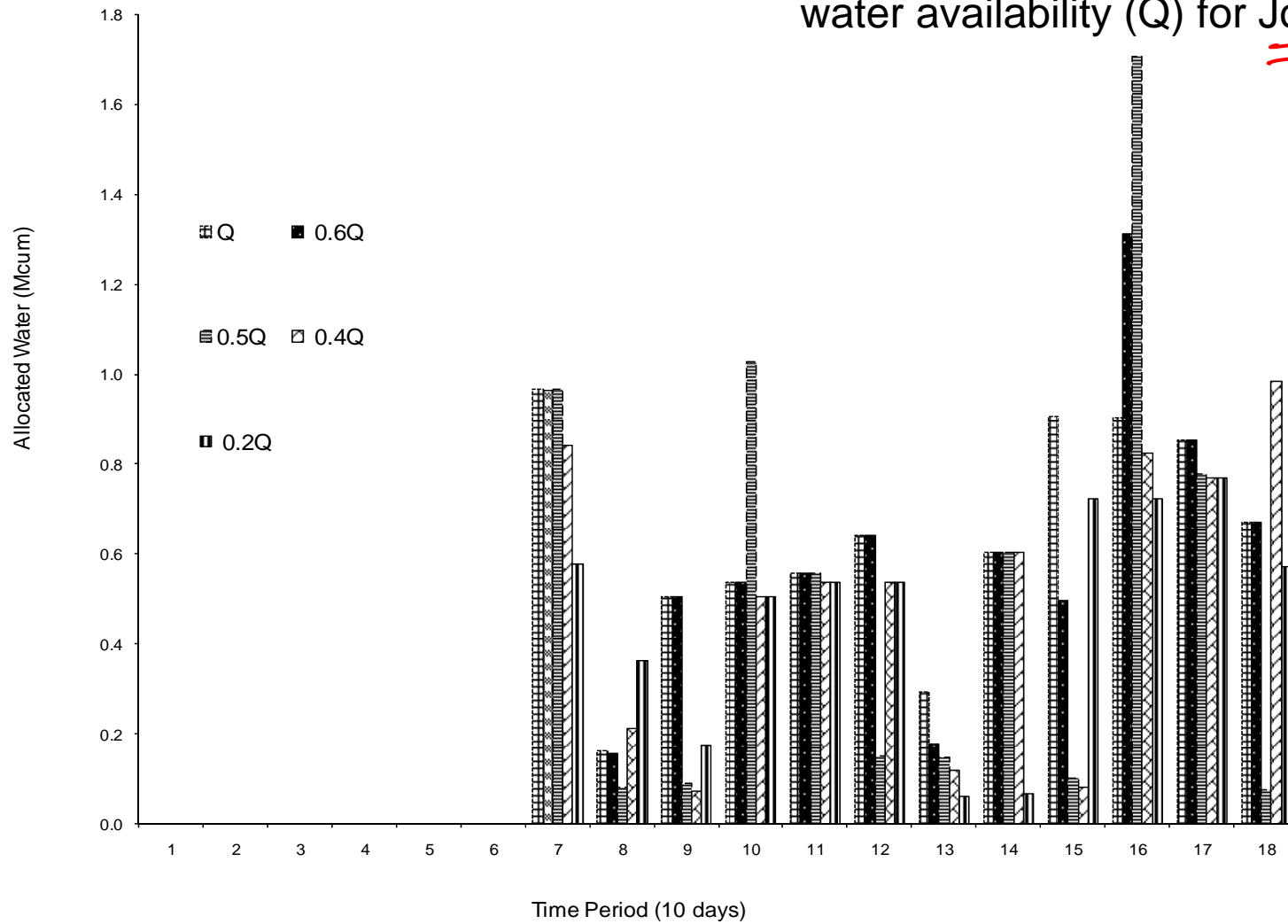
Crop Yield Optimization

Variation of water allocation with water availability (Q) for Cotton



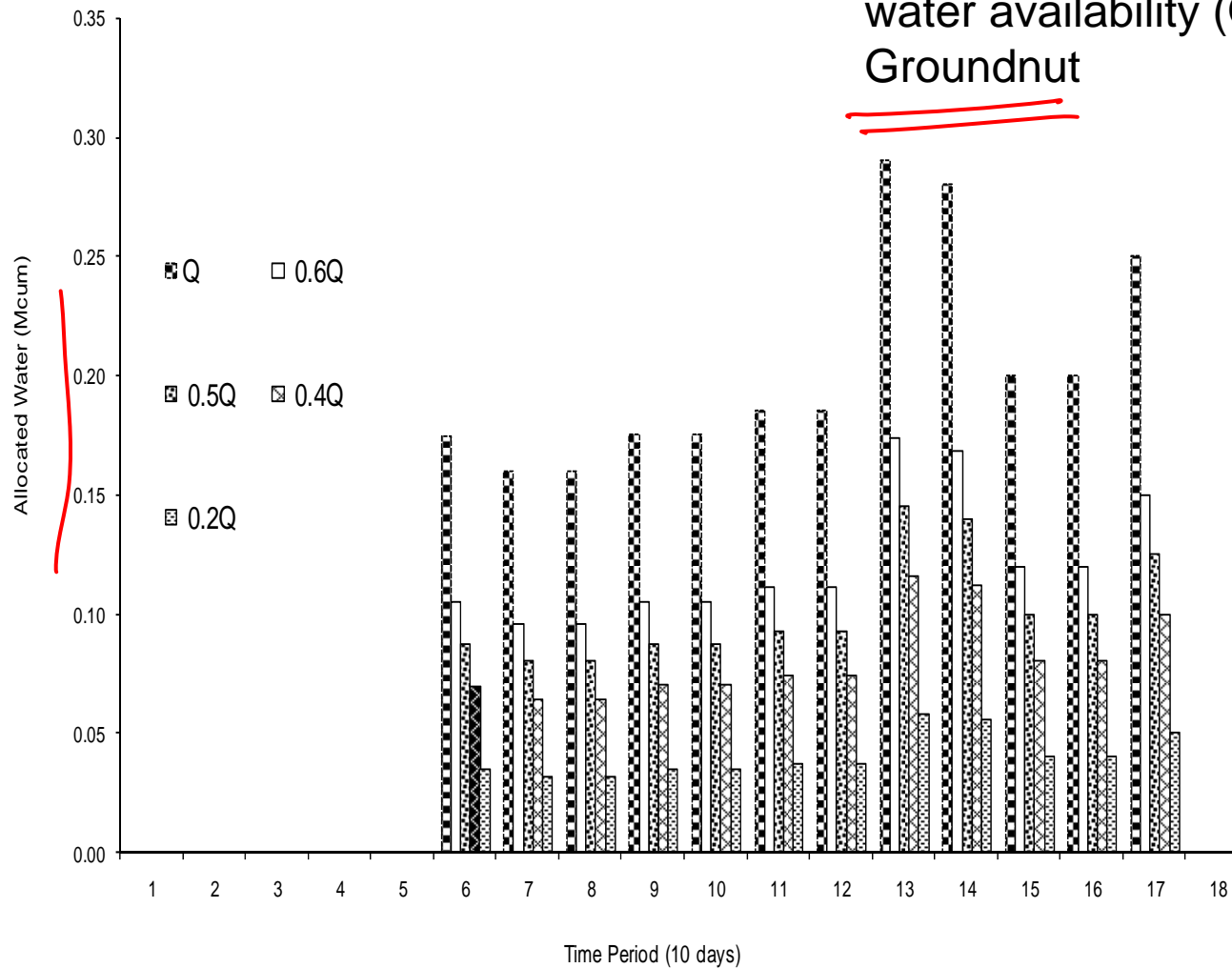
Crop Yield Optimization

Variation of water allocation with water availability (Q) for Jowar



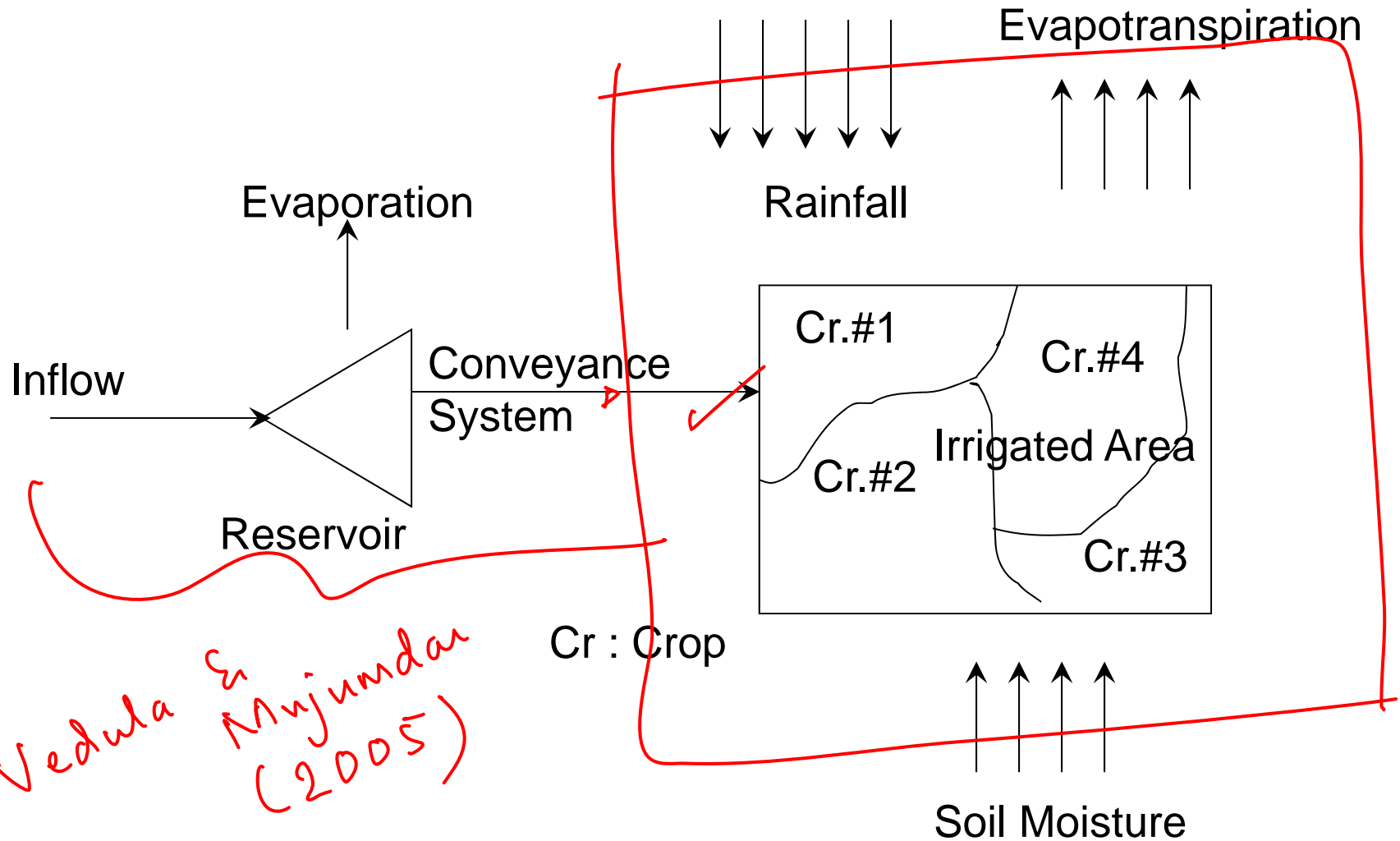
Crop Yield Optimization

Variation of water allocation with water availability (Q) for Groundnut



RESERVOIR OPERATION FOR IRRIGATION

Reservoir Operation for Irrigation



Vedula S. Manjundar (2005)

Cr : Crop