## BOZ780 Assignment 1

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## Question 1

Dashed lines represent  $z_1 = 5x_1 - x_2$ , dotted lines represent  $z_2 = x_1 + 4x_2$  and the feasible region, bounded by solid black lines is shaded gold. The co-ordinate grid in proceeding figures is represented as  $(x_2, x_1)$ , please take note of the axis.

## Question 1 (a): Graphical solution

The solution to  $z_2$  occurs at (5,0) where the solution for  $z_1$  occurs at (0,4) both indicated in turquoise. These points do not coincide.

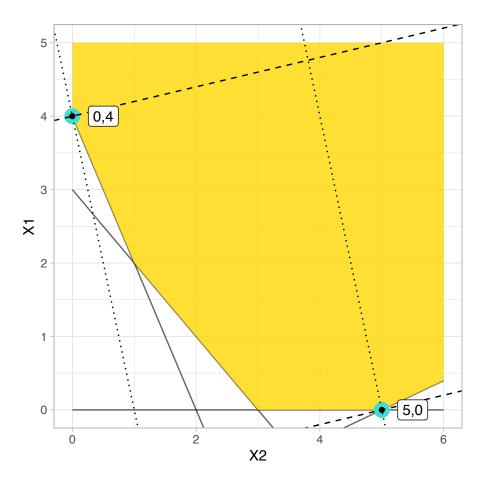


Figure 1: Optimal points of  $z_1$  and  $z_2$  are not located at the same position as the gradient of their respective objective functions are tangential to each other.

## Question 1 (b): Define points

Points are defined as efficient if there is no area below the intersection of  $z_1$  (dashed) and  $z_2$  (dotted) that lies within the feasible region.

- 1. (5,0) Efficient
- 2. (2,1) Efficient
- 3. (1,1) Infeasible
- 4. (1,2) Efficient
- 5. (0,5) Dominated

Point (0,5) is dominated as point (0,4) improves on the solution without degrading either objective.

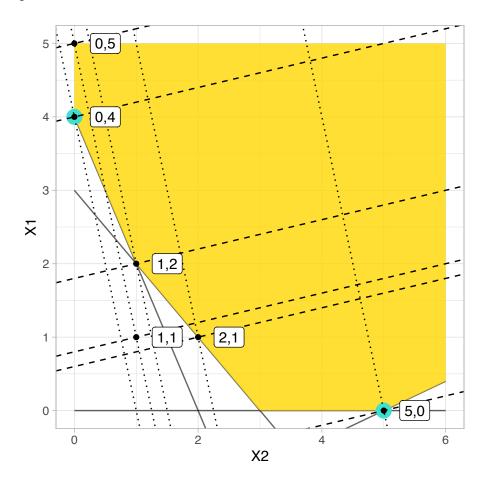


Figure 2: Efficient, dominated and other points

## Question 1 (c): Pre-emptive

## Minimise $z_1$

The solution found for  $z_1$  is introduced as a constraint reducing the solution in which  $z_2$  will attempt to find an efficient point in.

$$\min z_1 = 5x_1 - x_2 \tag{1}$$

Subject to:

$$-5x_1 + 2x_2 \le 10\tag{2}$$

$$x_1 + x_2 \ge 3 \tag{3}$$

$$x_1 + 2x_2 \ge 4 \tag{4}$$

$$x_1, x_2 \ge 0 \tag{5}$$

$$z_1 = -5 \tag{6}$$

$$x_1 = 0 (7)$$

$$x_2 = 5 (8)$$

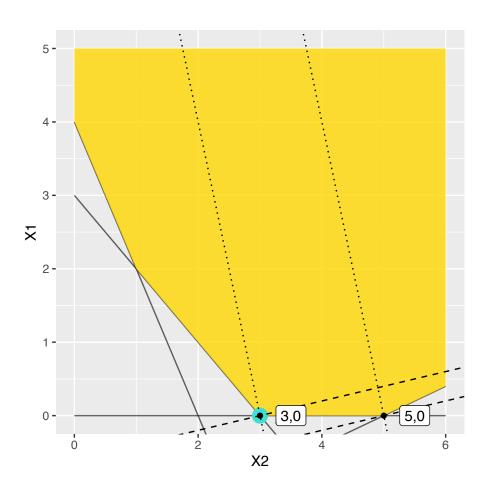


Figure 3: Pre-emptive feasible region with  $z_1$  optimal point at (5,0).

Minimise  $z_2$ 

$$\min z_2 = x_1 + 4x_2 \tag{9}$$

Subject to:

$$5x_1 - x_2 \le -5 \tag{10}$$

$$-5x_1 + 2x_2 \le 10 \tag{11}$$

$$x_1 + x_2 \ge 3 \tag{12}$$

$$x_1 + 2x_2 \ge 4 \tag{13}$$

$$x_1, x_2 \ge 0 \tag{14}$$

$$z_2 = 12 \tag{15}$$

$$x_1 = 0 (16)$$

$$x_2 = 3 \tag{17}$$

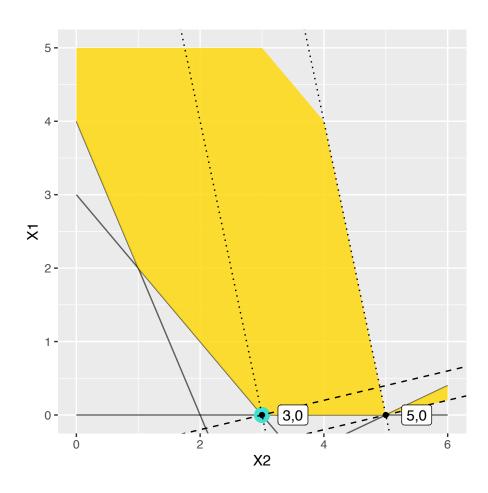


Figure 4: Pre-emptive feasible region including  $z_1$  constraint with  $z_2$  efficient point at (3,0)

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## Question 1 (d): Efficient frontier

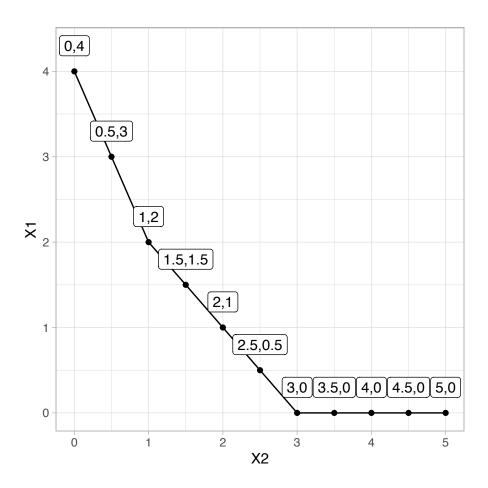


Figure 5: Efficient frontier for  $x_1$  and  $x_2$  in increments of 0.5

#### Question 2

The following assumptions apply to Question 2:

- The area required for a golf facility is stated as 62 0000 which exceeds the maximum area for site 1 and site 6. The lack of a thousand separator (620 000) and a large deviation from other sites indicates this may be a potential typo. A value of 62 000 has been used instead.
- Weights have been stated as 1000:10:1 which is assumed to reference P1:P2:P3 as priority one to three.

## Question 2 (a) - General formulation

#### Sets

I set of facility types  $I \in (1, ..., 4)$  as (Golf, Swimming, Gymnasium, Tennis) J set of sites  $J \in (1, ..., 6)$ 

#### **Parameters**

 $d_{ij}$  user days for facility i on site j  $i \in I, j \in J$   $a_j$  available land on site j in  $\mathrm{ft}^2$   $j \in J$   $c_i$  construction cost for facility i in i in

#### Variables

$$x_{ij}$$
 
$$\begin{cases} 1 & \text{facility } i \text{ is built on site } j \\ 0 & \text{if else} \end{cases}$$
  $i \in I, j \in J$ 

#### **Objectives**

$$\min \quad \sum_{i \in I} \sum_{j \in J} x_{ij} c_i \qquad (construction cost) \tag{1}$$

$$\min \sum_{j \in J} a_j - \sum_{i \in I} \sum_{j \in J} x_{ij} r_i \qquad \text{(unused land cost)}$$
 (2)

$$\max \sum_{i \in I} \sum_{j \in J} x_{ij} u_{ij} \qquad \text{(user days)}$$

$$\sum_{i \in I} x_{ij} r_i \le a_j \qquad \forall j \in J \qquad \text{(land capacity)} \qquad (4)$$

$$x_{i1} + x_{i6} = 0$$
  $\forall i \in (2, 3, 4)$  (no facilities on site 1 and 6) (5)  
 $x_{1j} = 0$   $\forall j \in (2, 3, 4, 5)$  (no golf on site 2 to 4) (6)

$$x_{11} + x_{16} \le 1$$
 (either site 1 or 6 can build golf) (7)

## Question 2 (b) - Basic goal programming

#### Sets

set of objectives  $K \in (1, 2, 3)$ 

set of facility types  $I \in (1, ..., 4)$  as (Golf, Swimming, Gymnasium, Tennis)

set of sites  $J \in (1, \ldots, 6)$ 

#### **Parameters**

user days for facility i on site j  $i \in I, j \in J$  available land on site j in  $\mathrm{ft}^2$   $j \in J$ 

construction cost for facility i in  $i \in I$  $c_i$ 

required land for facility i in  $ft^2$ 

#### Variables

$$x_{ij} \quad \begin{cases} 1 & \text{facility } i \text{ is built on site } j \\ 0 & \text{if else} \end{cases} \qquad i \in I, j \in J$$

deficiency variable for objective  $k \quad k \in K$ 

#### **Objectives**

$$\min \sum_{k \in K} d_k \qquad \text{(deficiencies)} \tag{8}$$

$$\sum_{j \in J} a_j - \sum_{i \in I} \sum_{j \in J} x_{ij} r_i - d_1 \le 40 \ 000 \ \text{ft}^2$$

$$\sum_{i \in I} \sum_{j \in J} x_{ij} r_i + d_1 \ge \sum_{j \in J} a_j - 40 \ 000 \ \text{ft}^2 \quad \text{(P1: unused land cost)}$$

$$\sum_{i \in I} \sum_{j \in J} x_{ij} c_i - d_2 < \$1.2 \text{ million}$$
 (P2: construction cost) (10)

$$\sum_{i \in I} \sum_{j \in J} x_{ij} u_{ij} + d_3 \ge 200 \,\, 000 \,\, \text{days} \tag{P3: user days} \tag{11}$$

$$\sum_{i \in I} x_{ij} r_i \le a_j \qquad \forall j \in J$$
 (land capacity) (12)

$$x_{i1} + x_{i6} = 0$$
  $\forall i \in (2, 3, 4)$  (no facilities on site 1 and 6) (13)  
 $x_{1j} = 0$   $\forall j \in (2, 3, 4, 5)$  (no golf on site 2 to 4) (14)  
 $x_{ij} + x_{ij} \leq 1$  (either site 1 or 6 can build golf) (15)

$$x_{1j} = 0$$
  $\forall j \in (2, 3, 4, 5)$  (no golf on site 2 to 4)

$$x_{11} + x_{16} \le 1$$
 (either site 1 or 6 can build golf) (15)

## Solution

Metric	Value	Target
Unused land	$234\ 000\ {\rm ft^2}$	$40\ 000\ {\rm ft^2}$
Used land	$271\ 000\ {\rm ft^2}$	-
Construction cost	\$ 980 000	\$ 1 200 000
User days	$148~000~\mathrm{days}$	$200~000~\mathrm{days}$

$$x_{ij} = \begin{bmatrix} 1 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 1 & 1 & 1 & 1 & 0 \end{bmatrix} \qquad d_k = \begin{bmatrix} 194 & 000 \\ 0 \\ 52 & 000 \end{bmatrix} \qquad \min(z) = 246 & 000 \tag{16}$$

## Question 2 (c) - Pre-emptive goal programming

#### Sets

set of objectives  $K \in (1, 2, 3)$ 

set of facility types  $I \in (1, ..., 4)$  as (Golf, Swimming, Gymnasium, Tennis)

set of sites  $J \in (1, \ldots, 6)$ 

#### **Parameters**

user days for facility i on site j $i \in I, j \in J$ 

available land on site j in  $ft^2$  $j \in J$ 

construction cost for facility i in \$  $i \in I$  $c_i$ 

required land for facility i in  $ft^2$ 

#### Variables

$$x_{ij}$$
 
$$\begin{cases} 1 & \text{facility } i \text{ is built on site } j \\ 0 & \text{if else} \end{cases}$$
  $i \in I, j \in J$ 

deficiency variable for objective  $k \in K$ 

#### **Objectives**

$$\min \quad d_1 \tag{17}$$

$$\min \quad d_2 \qquad \qquad \text{(subject to } d_1\text{)} \tag{18}$$

min 
$$d_3$$
 (subject to  $d_1$  and  $d_2$ ) (19)

$$d_1 = 0 (used in d_2 and d_3) (20)$$

$$d_2 = 0 (used in d_3) (21)$$

$$\sum_{i \in I} \sum_{j \in J} x_{ij} r_i + d_1 \ge \sum_{j \in J} a_j - 40\ 000\ \text{ft}^2$$
 (P1: unused land cost) (22)

$$\sum_{i \in I} \sum_{j \in J} x_{ij} c_i - d_2 < \$1.2 \text{ million}$$
 (P2: construction cost) (23)

$$\sum_{i \in I} \sum_{j \in I} x_{ij} u_{ij} + d_3 \ge 200 \ 000 \ \text{days}$$
 (P3: user days) (24)

$$\sum_{i \in I} x_{ij} r_i \le a_j \qquad \forall j \in J \tag{25}$$

$$x_{i1} + x_{i6} = 0$$
  $\forall i \in (2, 3, 4)$  (no facilities on site 1 and 6) (26)  
 $x_{1j} = 0$   $\forall j \in (2, 3, 4, 5)$  (no golf on site 2 to 4) (27)

$$x_{1i} = 0$$
  $\forall j \in (2, 3, 4, 5)$  (no golf on site 2 to 4) (27)

$$x_{11} + x_{16} \le 1$$
 (either site 1 or 6 can build golf) (28)

#### Solution: P1

Metric	Value	Target
Unused land	$107\ 000\ {\rm ft^2}$	$40~000~{\rm ft}^2$
Used land	$398~000~{\rm ft^2}$	-
Construction cost	\$ 4 015 000	\$ 1 200 000
User days	$277~000~\mathrm{days}$	$200~000~\mathrm{days}$

$$x_{ij} = \begin{bmatrix} 1 & 0 & 0 & 0 & 0 & 0 \\ 0 & 1 & 1 & 0 & 1 & 0 \\ 0 & 1 & 0 & 1 & 1 & 0 \\ 0 & 0 & 1 & 1 & 1 & 0 \end{bmatrix} \qquad d_1 = \begin{bmatrix} 67 & 000 \end{bmatrix} \qquad \min(z) = 67 & 000 \qquad (29)$$

#### Solution: P2

A new constraint was included whereby  $d_1 \le 67000$ .

Metric	Value	Target
Unused land	$107\ 000\ {\rm ft^2}$	$40~000~{\rm ft}^2$
Used land	$398~000~{\rm ft}^2$	-
Construction cost	\$ 4 015 000	\$ 1 200 000
User days	$277~000~\mathrm{days}$	$200~000~\mathrm{days}$

$$x_{ij} = \begin{bmatrix} 1 & 0 & 0 & 0 & 0 & 0 \\ 0 & 1 & 1 & 0 & 1 & 0 \\ 0 & 1 & 0 & 1 & 1 & 0 \\ 0 & 0 & 1 & 1 & 1 & 0 \end{bmatrix} \qquad d_2 = \begin{bmatrix} 2 & 815 & 000 \end{bmatrix} \qquad \min(z) = 2 & 815 & 000 \tag{30}$$

#### Solution: P3

Two new constraint were included whereby  $d_1 \le 67\ 000$  and  $d_2 \le 2\ 815\ 000$ .

Metric	Value	Target
Unused land	$107\ 000\ {\rm ft^2}$	$40\ 000\ {\rm ft^2}$
Used land	$398~000~{\rm ft^2}$	-
Construction cost	\$ 4 015 000	\$ 1 200 000
User days	$277~000~\mathrm{days}$	$200~000~\mathrm{days}$

$$x_{ij} = \begin{bmatrix} 1 & 0 & 0 & 0 & 0 & 0 \\ 0 & 1 & 1 & 0 & 1 & 0 \\ 0 & 1 & 0 & 1 & 1 & 0 \\ 0 & 0 & 1 & 1 & 1 & 0 \end{bmatrix} \qquad d_3 = \begin{bmatrix} 0 \end{bmatrix} \qquad \min(z) = 0 \qquad (31)$$

The first priority ensured that area was maximised, inadvertently ensuring more user days (than targeted) could occur. However, the construction cost greatly increased and with the imposed  $d_1$  constraint could not decrease after the second minimisation attempt.

## Question 2 (d) - Weighted sum goal programming

#### Sets

Kset of objectives  $K \in (1, 2, 3)$ 

set of facility types  $I \in (1, ..., 4)$  as (Golf, Swimming, Gymnasium, Tennis)

set of sites  $J \in (1, \ldots, 6)$ 

#### **Parameters**

user days for facility i on site j $i \in I, j \in J$ 

available land on site j in  $ft^2$  $j \in J$ 

construction cost for facility i in  $i \in I$  $c_i$ 

required land for facility i in  $ft^2$  $i \in I$ 

#### Variables

$$x_{ij}$$
 
$$\begin{cases} 1 & \text{facility } i \text{ is built on site } j \\ 0 & \text{if else} \end{cases}$$
  $i \in I, j \in J$ 

deficiency variable for objective  $k \in K$ 

#### **Objectives**

$$\min \quad 1000d_1 + 10d_2 + d_3 \tag{32}$$

#### Constraints

$$\sum_{i \in I} \sum_{j \in I} x_{ij} r_i + d_1 \ge \sum_{j \in I} a_j - 40\ 000\ \text{ft}^2$$
 (P1: unused land cost) (33)

$$\sum_{i \in I} \sum_{j \in J} x_{ij} c_i - d_2 < \$1.2 \text{ million}$$
 (P2: construction cost) (34)

$$\sum_{i \in I} \sum_{j \in J} x_{ij} u_{ij} + d_3 \ge 200 \ 000 \ \text{days}$$
 (P3: user days) (35)

$$\sum_{i \in I} x_{ij} r_i \le a_j \qquad \forall j \in J \tag{136}$$

$$x_{i1} + x_{i6} = 0$$
  $\forall i \in (2, 3, 4)$  (no facilities on site 1 and 6) (37)  
 $x_{1j} = 0$   $\forall j \in (2, 3, 4, 5)$  (no golf on site 2 to 4) (38)

$$x_{1j} = 0$$
  $\forall j \in (2, 3, 4, 5)$  (no golf on site 2 to 4)

$$x_{11} + x_{16} \le 1$$
 (either site 1 or 6 can build golf) (39)

## Solution

Metric	Value	${f Target}$
Unused land	$107\ 000\ {\rm ft^2}$	$40\ 000\ {\rm ft}^2$
Used land	$398~000~{\rm ft^2}$	-
Construction cost	\$ 4 015 000	\$ 1 200 000
User days	$277~000~\mathrm{days}$	$200~000~\mathrm{days}$

$$x_{ij} = \begin{bmatrix} 1 & 0 & 0 & 0 & 0 & 0 \\ 0 & 1 & 1 & 0 & 1 & 0 \\ 0 & 1 & 0 & 1 & 1 & 0 \\ 0 & 0 & 1 & 1 & 1 & 0 \end{bmatrix} \qquad d_k = \begin{bmatrix} 67 & 000 \\ 2 & 814 & 999 \\ 0 \end{bmatrix} \qquad \min(z) = 95 & 150 & 000 \tag{40}$$

## Question 2 (e) - Basic goal programming efficiency adjustment

#### Sets

K set of objectives  $K \in (1,2,3)$ 

I set of facility types  $I \in (1, ..., 4)$  as (Golf, Swimming, Gymnasium, Tennis)

J set of sites  $J \in (1, \ldots, 6)$ 

#### **Parameters**

 $d_{ij}$  user days for facility i on site j  $i \in I, j \in J$   $a_j$  available land on site j in  $\operatorname{ft}^2$   $j \in J$   $c_i$  construction cost for facility i in i in

#### Variables

$$x_{ij} \quad \begin{cases} 1 & \text{facility $i$ is built on site $j$} \\ 0 & \text{if else} \end{cases} \quad i \in I, j \in J$$
 
$$d_k \quad \text{deficiency variable for objective $k$} \quad k \in K$$

#### **Objectives**

A small number 0.26 has been selected as the adjustment factor with positive and negative signs applied for minimisation and maximisation respectively.

$$\min \sum_{k \in K} d_k + 0.001 \left( \sum_{i \in I} \sum_{j \in J} x_{ij} c_i \right) \\
- 0.26 \left( \sum_{i \in I} \sum_{j \in J} x_{ij} r_i \right) \\
- 0.26 \left( \sum_{i \in I} \sum_{j \in J} x_{ij} u_{ij} \right) \tag{41}$$

The unused area objective function (2) has been converted from a minimisation of unused area to a maximisation of used area resulting in a -0.26 factor. The outcome of the objective is unchained and the constant  $a_j$  is removed whilst the land capacity constraint prevents the area of used land from surpassing what is available.

$$\sum_{i \in I} \sum_{j \in J} x_{ij} r_i + d_1 \ge \sum_{j \in J} a_j - 40\ 000\ \text{ft}^2$$
 (P1: unused land cost) (42)

$$\sum_{i \in I} \sum_{j \in I} x_{ij} c_i - d_2 < \$1.2 \text{ million}$$
 (P2: construction cost) (43)

$$\sum_{i \in I} \sum_{j \in J} x_{ij} u_{ij} + d_3 \ge 200 \ 000 \ \text{days}$$
 (P3: user days) (44)

$$\sum_{i \in I} x_{ij} r_i \le a_j \qquad \forall j \in J \qquad \text{(land capacity)} \qquad (45)$$

$$x_{i1} + x_{i6} = 0 \qquad \forall i \in (2, 3, 4) \qquad \text{(no facilities on site 1 and 6)} \qquad (46)$$

$$x_{1j} = 0 \qquad \forall j \in (2, 3, 4, 5) \qquad \text{(no golf on site 2 to 4)} \qquad (47)$$

$$x_{1j} + x_{1j} \le 1 \qquad \text{(either site 1 or 6 can build golf)} \qquad (48)$$

$$x_{i1} + x_{i6} = 0$$
  $\forall i \in (2, 3, 4)$  (no facilities on site 1 and 6) (46)

$$x_{1j} = 0$$
  $\forall j \in (2, 3, 4, 5)$  (no golf on site 2 to 4)

$$x_{11} + x_{16} \le 1$$
 (either site 1 or 6 can build golf) (48)

#### Solution

Metric	Value	$\mathbf{Target}$
Unused land	$263\ 000\ {\rm ft^2}$	$40~000~{\rm ft}^2$
Used land	$242\ 000\ {\rm ft^2}$	-
Construction cost	\$ 680 000	\$ 1 200 000
User days	$116~000~\mathrm{days}$	$200~000~\mathrm{days}$

Including the efficiency adjustment results in the cheaper facility being built over others. The co-efficient values attributed to cost far exceed that of area and user days giving it a greater relative weight.

#### Question 1 R Code

```
library(tidyverse)
library(gridExtra)
library(lpSolve)
library(extrafont)
### ======= Question 1
w <- 12
h <- 12
lp(direction = "min",
   objective.in = c(1,4),
   const.mat = matrix(c(-5,1,1,0,1,
                        2,1,2,1,0), ncol = 2, byrow = FALSE),
   const.dir = c("<=",">=",">=",">=",">=",">="),
   const.rhs = c(10,3,4,0,0))$solution
lengthX <- 6
lengthY <- 5
x <- 0:lengthX
c1 <- (x)*2/5-2
c2 < -x +3
c3 < -2*x+4
c4 <- rep(0,lengthX+1)
df.points <- data.frame(x=c(0,1,1,2,5,0),
                        y=c(5,2,1,1,0,4))
df.pointsOptimal <- data.frame(x=c(0,5),</pre>
                                y=c(4,0)
point.coords = paste(df.points$x,df.points$y,sep=",")
z1.intercept <- df.points$y -1/5*df.points$x</pre>
z2.intercept <- df.points$y +4 *df.points$x</pre>
# ==== Optimal points
pointOptimal.coords = paste(df.pointsOptimal$x,df.pointsOptimal$y,sep=",")
data.frame(x, c1,c2,c3,c4) %>%
  ggplot(aes(x = x))+
  geom_line(aes(y=c1), alpha = 0.6)+
  geom_line(aes(y=c2), alpha = 0.6)+
  geom_line(aes(y=c3), alpha = 0.6)+
  geom_line(aes(y=c4), alpha = 0.6)+
  geom_ribbon(aes(ymin = pmax(c1,c2,c3,c4),
                  ymax = lengthY),
                  fill = 'gold',
                  alpha = 0.8)+
  geom_point(data = df.pointsOptimal, aes(x=x, y=y), color = "turquoise", size = 5)+
```

```
geom_point(data = df.pointsOptimal, aes(x=x, y=y))+
  coord_cartesian(xlim = c(0,lengthX), ylim = c(0,lengthY))+
  labs(x="X2", y="X1")+
  geom_abline(slope = 1/5, intercept = c(4,-1), linetype = "dashed", color = "black")+
  geom_abline(slope = -4, intercept = c(4,20), linetype = "dotted", color = "black")+
  geom_label(data = df.pointsOptimal,aes(x+.5,y,label=pointOptimal.coords))+
  theme_light()
ggsave("Optimal_points_Z1_Z2.pdf",dpi = "retina", width = w, height = h, units = "cm")
# === Which points are eff
data.frame(x, c1,c2,c3,c4) %>%
  ggplot(aes(x = x))+
  geom_line(aes(y=c1), alpha = 0.6)+
  geom_line(aes(y=c2), alpha = 0.6)+
  geom_line(aes(y=c3), alpha = 0.6)+
  geom_line(aes(y=c4), alpha = 0.6)+
  geom_ribbon(aes(ymin = pmax(c1,c2,c3,c4),
                  ymax = lengthY),
              fill = 'gold',
              alpha = 0.8) +
  geom_point(data = df.pointsOptimal, aes(x=x, y=y), color = "turquoise", size = 5)+
  geom_point(data = df.points, aes(x=x, y=y))+
  coord_cartesian(xlim = c(0,lengthX), ylim = c(0,lengthY))+
  labs(x="X2", y="X1")+
  geom_abline(slope = 1/5, intercept = z1.intercept, linetype = "dashed", color = "black"
  geom_abline(slope = -4, intercept = z2.intercept, linetype = "dotted", color = "black")
  geom_label(data = df.points,aes(x+.5,y,label=point.coords))+
  theme_light()
ggsave("Efficient_dominated_other_points.pdf",dpi = "retina", width = w, height = h, unit
# Question 1 c - pre-emptive
z1 <- lp(direction = "min",</pre>
   objective.in = c(5,-1),
   const.mat = matrix(c(-5,1,1,0,1,
                         2,1,2,1,0), ncol = 2, byrow = FALSE),
   const.dir = c("<=",">=",">=",">=",">="),
   const.rhs = c(10,3,4,0,0))
z2 <- lp(direction = "min",</pre>
         objective.in = c(1,4),
         const.mat = matrix(c(-5,1,1,0,1,1,0,
                               2,1,2,1,0,0,1),ncol = 2,byrow = FALSE),
         const.dir = c("<=",">=",">=",">=",">=","<=","<="),
         const.rhs = c(10,3,4,0,0,z1\$solution[1],z1\$solution[2]))
```

```
z1$solution
z2$solution
df.pointsOptimal <- data.frame(y=c(z1$solution[1],z2$solution[1]),</pre>
                                x=c(z1$solution[2],z2$solution[2]))
point.coords = paste(df.pointsOptimal$x,df.pointsOptimal$y,sep=",")
z1.intercept <- df.pointsOptimal$y -1/5*df.pointsOptimal$x</pre>
z2.intercept <- df.pointsOptimal$y +4 *df.pointsOptimal$x</pre>
data.frame(x,c1,c2,c3,c4) %>%
  ggplot(aes(x = x))+
  geom_line(aes(y=c1), alpha = 0.6)+
  geom_line(aes(y=c2), alpha = 0.6)+
  geom_line(aes(y=c3), alpha = 0.6)+
  geom_line(aes(y=c4), alpha = 0.6)+
  geom_ribbon(aes(ymin = pmax(c1,c2,c3,c4),
                  ymax = lengthY),
              fill = 'gold',
              alpha = 0.8)+
  geom_point(data = df.pointsOptimal[2,], aes(x=x, y=y), color = "turquoise", size = 5)+
  geom_point(data = df.pointsOptimal, aes(x=x, y=y))+
  coord_cartesian(xlim = c(0,lengthX), ylim = c(0,lengthY))+
  labs(x="X2", y="X1")+
  geom_abline(slope = 1/5, intercept = z1.intercept, linetype = "dashed", color = "black"
  geom_abline(slope = -4, intercept = z2.intercept, linetype = "dotted", color = "black")
  geom_label(data = df.pointsOptimal,aes(x+.5,y,label=point.coords))
ggsave("Pre_emptive.pdf",dpi = "retina", width = w, height = h, units = "cm")
#Pre-emptive with constraint from past solution
c5 < -1/5*(x)-1
upper <- rep(lengthY, lengthX+1)</pre>
data.frame(x,c1,c2,c3,c4,c5) %>%
  ggplot(aes(x = x))+
  geom_line(aes(y=c1), alpha = 0.6)+
  geom_line(aes(y=c2), alpha = 0.6)+
  geom_line(aes(y=c3), alpha = 0.6)+
  geom_line(aes(y=c4), alpha = 0.6)+
  geom_ribbon(aes(ymin = pmax(c1,c2,c3,c4),
                  ymax = c(5,5,5,5,4,0,0.2)),
              fill = 'gold',
              alpha = 0.8) +
  geom_point(data = df.pointsOptimal[2,], aes(x=x, y=y), color = "turquoise", size = 5)+
```

```
coord_cartesian(xlim = c(0,lengthX), ylim = c(0,lengthY))+
  labs(x="X2", y="X1")+
  geom_abline(slope = 1/5, intercept = z1.intercept, linetype = "dashed", color = "black"
  geom_abline(slope = -4, intercept = z2.intercept, linetype = "dotted", color = "black")
  geom_label(data = df.pointsOptimal,aes(x+.5,y,label=point.coords))
ggsave("Pre_emptive2.pdf",dpi = "retina", width = w, height = h, units = "cm")
# Eff fronteir
z2.seq < - seq(0,5,0.5)
df.eff <- data.frame(Obj=z2.seq, x=z2.seq, y=z2.seq)</pre>
for (i in z2.seq){
  ef.front <- lp(direction = "min",</pre>
     objective.in = c(5,-1),
     const.mat = matrix(c(-5,1,1,0,1,0,
                            2,1,2,1,0,1), ncol = 2, byrow = FALSE),
     const.dir = c("<=",">=",">=",">=",">=",">=","<="),
     const.rhs = c(10,3,4,0,0,i))
  df.eff$Obj[n] <- ef.front$objval</pre>
  df.eff$x[n] <- ef.front$solution[2]</pre>
  df.eff$y[n] <- ef.front$solution[1]</pre>
 n <- n+1
}
df.eff %>%
  ggplot(aes(x=x, y=y))+
  geom_path()+
  geom_point()+
  labs(x="X2", y="X1")+
  geom_label(aes(x,y+.3,label=paste(x,y,sep=",")))+
  theme_light()
ggsave("Efficient_frontier.pdf",dpi = "retina", width = w, height = h, units = "cm")
```

geom\_point(data = df.pointsOptimal, aes(x=x, y=y))+

#### Question 2 R Code

```
library(tidyverse)
library(lpSolve)
matmaker <- function(index,length){</pre>
  vec <- rep(0,length)</pre>
  vec[index] <- 1</pre>
  return(vec)
#======= Q2
#====== Parameters
i < -4
j <- 6
k <- 3
uij <- 1000* c(31, 0, 0, 0, 0,27,
                0,25,21,32,32, 0,
                0,37,29,38,28, 0,
                0,20,23,22,20, 0)
aj <-1000* rep(c(80,70,80,90,120,65),i)
ci <- rep(c(340000, 300000, 840000, 85000),j) %>% matrix(nrow = i, byrow = F) %>% t() %>%
ri <- rep(c(62000 ,29000 ,38000 ,45000),j) %>% matrix(nrow = i, byrow = F) %>% t() %>% a
dk \leftarrow c(0,0,0)
dk.k \leftarrow c(rep(0,j*i),c(1,1,1))
uij.k <- c(dij, dk)
aj.k \leftarrow c(aj, dk)
ci.k <- c(ci, dk)
ri.k <- c(ri, dk)
len <- length(ri.k)</pre>
fn.cost <- function(lpsolve.out){</pre>
   cost.landused <- sum(lpsolve.out[1:24]*ri)</pre>
   cost.landunused <- -sum(lpsolve.out[1:24]*ri) + sum(1000*c(80,70,80,90,120,65))
   cost.construction <- sum(lpsolve.out[1:24]*ci)</pre>
   cost.userdays <- sum(lpsolve.out[1:24]*uij)</pre>
   return(paste(paste("Used land",cost.landused,sep = ": "),
                paste("Unused land",cost.landunused,sep = ": "),
                paste("Construction cost",cost.construction,sep = ": "),
                                                                              "))
                paste("User days",cost.userdays,sep = ": "),sep = "
}
#====== Constraints
cons1.lhs <- c(ri.k*matmaker(c(1,7,13,19),len),
               ri.k*matmaker(c(1+1,7+1,13+1,19+1),len),
               ri.k*matmaker(c(1+2,7+2,13+2,19+2),len),
               ri.k*matmaker(c(1+3,7+3,13+3,19+3),len),
```

```
ri.k*matmaker(c(1+4,7+4,13+4,19+4),len),
               ri.k*matmaker(c(1+5,7+5,13+5,19+5),len)) %>% matrix(nrow = 6, byrow = T)
cons1.rhs <- 1000*c(80,70,80,90,120,65)
cons2.lhs <- (rep(1,len)*matmaker(c(7,13,19,12,18,24,2,3,4,5),len))#[1:24] %>% matrix(nro
cons2.rhs <- 0
cons3.lhs <- (rep(1,len)*matmaker(c(1,6),len))#[1:24] \%\% matrix(nrow = 4, byrow = T)
cons3.rhs <- 1
base.cons.lhs <- rbind(cons1.lhs,cons2.lhs,cons3.lhs)</pre>
base.cons.rhs <- c(cons1.rhs, cons2.rhs, cons3.rhs)
base.cons.dir <- c(rep("<=",j), "=","<=")
#======= Q2B
q2b.obj \leftarrow rep(1,len)*matmaker(c(27,26,25),len)
cons1.lhs <- (ri.k+dk.k*matmaker(25,len))#[1:24] %>% matrix(nrow = 4, byrow = T)
cons1.rhs \leftarrow -40000 + (1000*sum(80,70,80,90,120,65))
cons2.lhs <- ci.k-dk.k*matmaker(26,len)</pre>
cons2.rhs <- 1200000
cons3.lhs <- uij.k+dk.k*matmaker(27,len)</pre>
cons3.rhs <- 200000
q2b.cons.lhs <- rbind(base.cons.lhs, cons1.lhs, cons2.lhs, cons3.lhs)
q2b.cons.rhs <- c(base.cons.rhs, cons1.rhs, cons2.rhs, cons3.rhs)
q2b.cons.dir <- c(base.cons.dir, ">=","<",">=")
q2b.lp <- lp(direction = "min",
   objective.in = q2b.obj,
   const.mat = q2b.cons.lhs,
   const.rhs = q2b.cons.rhs,
   const.dir = q2b.cons.dir,
   binary.vec = 1:24)
q2b.lp
q2b.lp$solution[1:24] %>% matrix(nrow = i, byrow = T)
q2b.lp$solution[25:27]
q2b.lp$solution %>% fn.cost()
#====== Q2C
#====== P1
q2c.obj.p1 <- rep(1,len)*matmaker(c(25),len)</pre>
q2c.lp <- lp(direction = "min",
             objective.in = q2c.obj.p1,
             const.mat = q2b.cons.lhs,
             const.rhs = q2b.cons.rhs,
             const.dir = q2b.cons.dir,
             binary.vec = 1:24)
q2c.lp
q2c.lp$solution[1:24] %>% matrix(nrow = i, byrow = T)
```

```
q2c.lp$solution[25:27] %>% as.integer()
q2c.lp$solution %>% fn.cost
#====== P2
q2c.obj.p2 <- rep(1,len)*matmaker(c(26),len)
cons1.lhs <- rep(1,len)*matmaker(25,len)</pre>
cons1.rhs <- q2c.lp$solution[25]</pre>
cons1.dir <- "<="
q2c.cons.lhs.p2 <- rbind(q2b.cons.lhs, cons1.lhs)</pre>
q2c.cons.rhs.p2 <- c(q2b.cons.rhs,cons1.rhs)</pre>
q2c.cons.dir.p2 <- c(q2b.cons.dir,cons1.dir)</pre>
q2c.lp.p2 <- lp(direction = "min",
             objective.in = q2c.obj.p2,
             const.mat = q2c.cons.lhs.p2,
             const.rhs = q2c.cons.rhs.p2,
             const.dir = q2c.cons.dir.p2,
             binary.vec = 1:24)
q2c.1p.p2
q2c.lp.p2$solution[1:24] %>% matrix(nrow = i, byrow = T)
q2c.lp.p2$solution[25:27] %>% as.integer()
q2c.lp.p2$solution %>% fn.cost()
#====== P3
q2c.obj.p3 <- rep(1,len)*matmaker(c(27),len)
cons1.lhs <- rep(1,len)*matmaker(26,len)</pre>
cons1.rhs <- q2c.lp.p2$solution[26]</pre>
cons1.dir <- "<="
q2c.cons.lhs.p3 <- rbind(q2c.cons.lhs.p2, cons1.lhs)
q2c.cons.rhs.p3 <- c(q2c.cons.rhs.p2,cons1.rhs)</pre>
q2c.cons.dir.p3 <- c(q2c.cons.dir.p2,cons1.dir)</pre>
q2c.lp.p3 <- lp(direction = "min",
                objective.in = q2c.obj.p3,
                const.mat = q2c.cons.lhs.p3,
                const.rhs = q2c.cons.rhs.p3,
                const.dir = q2c.cons.dir.p3,
                binary.vec = 1:24)
q2c.lp.p3
q2c.lp.p3$solution[1:24] %>% matrix(nrow = i, byrow = T)
q2c.lp.p3$solution[25:27] %>% as.integer()
q2c.lp.p3$solution %>% fn.cost()
#====== Q2D
q2d.obj <- rep(1,len)*matmaker(c(27,26,25),len)
q2d.obj[25] <- 1000
q2d.obj[26] <- 10
q2d.obj[27] <- 1
```

```
q2d.lp <- lp(direction = "min",
             objective.in = q2d.obj,
             const.mat = q2b.cons.lhs,
             const.rhs = q2b.cons.rhs,
             const.dir = q2b.cons.dir,
             binary.vec = 1:24)
q2d.lp
q2d.lp$solution[1:24] %>% matrix(nrow = i, byrow = T)
q2d.lp$solution[25:27]
q2d.lp$solution %>% fn.cost()
#======= Q2E
q2e.obj <- 0.26*(ci.k - uij.k - ri.k)
                                         #ri is treated as maximization
q2e.obj[25:27] \leftarrow c(1,1,1)
q2e.lp <- lp(direction = "min",
             objective.in = q2e.obj,
             const.mat = q2b.cons.lhs,
             const.rhs = q2b.cons.rhs,
             const.dir = q2b.cons.dir,
             binary.vec = 1:24)
q2e.lp
q2e.lp$solution[1:24] %>% matrix(nrow = i, byrow = T)
q2e.lp$solution[25:27]
q2e.lp$solution %>% fn.cost()
# Results
q2b.lp$solution %>% fn.cost()
q2b.lp
q2b.lp$solution[1:24] %>% matrix(nrow = i, byrow = T)
q2b.lp$solution[25:27] %>% as.integer()
q2c.lp$solution %>% fn.cost()
q2c.lp
q2c.lp$solution[1:24] %>% matrix(nrow = i, byrow = T)
q2c.lp$solution[25:27] %>% as.integer()
q2c.lp.p2$solution %>% fn.cost()
q2c.lp.p2
q2c.lp.p2$solution[1:24] %>% matrix(nrow = i, byrow = T)
q2c.lp.p2$solution[25:27] %>% as.integer()
q2c.lp.p3$solution %>% fn.cost()
q2c.lp.p3
q2c.lp.p3$solution[1:24] %>% matrix(nrow = i, byrow = T)
q2c.lp.p3$solution[25:27] %>% as.integer()
```

```
q2d.lp$solution %>% fn.cost()
q2d.lp
q2d.lp$solution[1:24] %>% matrix(nrow = i, byrow = T)
q2d.lp$solution[25:27] %>% as.integer()

q2e.lp$solution %>% fn.cost()
q2e.lp
q2e.lp$solution[1:24] %>% matrix(nrow = i, byrow = T)
q2e.lp$solution[25:27] %>% as.integer()
```