## Operations Research Applications HW2, Fall 2022 (111-1)

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### Problem 1: Stochastic Programming (45%)

#### (a) Defining variables and Formulation

Let  $x_1$  be the number of acres to plant wheat;  $x_2$  be the number of acres to plant corn;  $x_3$  be the number of acres to plant sugar beet.  $w_1$  be the sold wheat in tons;  $w_2$  be the sold corn in tons.  $w_3$  be the sold sugar beets in tons at \$36/ton;  $w_4$  be the sold sugar beets in tons at \$10/ton.  $y_1$  be the purchased wheat in tons;  $y_2$  be the purchased corn in tons.

$$\max \quad (170w_1 - 150x_1 - 238y_1) + (150w_2 - 230x_2 - 210y_2) + (36w_3 + 10w_4 - 260x_3)$$
s.t. 
$$x_1 + x_2 + x_3 \le 500$$

$$2.5x_1 - y_1 - w_1 \ge 200$$

$$3x_2 - y_2 - w_2 \ge 240$$

$$w_3 \le 6000$$

$$20x_3 - w_3 - w_4 \ge 0$$

$$x_i \ge 0 \quad \forall i = 1, 2, 3$$

$$w_i \ge 0 \quad \forall i = 1, ..., 4$$

$$y_i \ge 0 \quad \forall i = 1, 2$$

#### (b) Solve the Scenario Analysis and EV solution

#### Scenario Analysis

(1) Low: We grow 100 acres of wheat, 25 acres of corn, 375 acres of sugar beets. Objective value: \$59,950.

- (2) Medium: We grow 120 acres of wheat, 80 acres of corn, 300 acres of sugar beets. Objective value: \$118,600.
- (3) High: We grow 183.33 acres of wheat, 66,6 acres of corn, 250 acres of sugar beets. Objective value: \$167,666,66.

The weighted mean of the objective value over the 3 scenarios is \$115,405.5.

#### **EV** Solution

is the medium solution in Scenario Analysis/Wait-n-see, because the probability of each of the 3 scenarios are equal. We grow 120 acres of wheat, 80 acres of corn, 300 acres of sugar beets. Objective value: \$118,600.

#### (c) Define new decision variables for RP-DEP.

Let  $x_i$  be the number of acres to plant the crop defined in (a).  $w_i^{\omega}$  be the sold crop defined in (a) under scenario  $\omega \in \Omega$ . Similarly,  $y_i^{\omega}$  be the purchased wheat and corn in tons under scenario  $\omega \in \Omega$ . The formulation aims to maximize the total profit.

$$\begin{array}{lll} \max & -\left(150x_{1}+230x_{2}+260x_{3}\right)+\Sigma_{\omega\in\Omega}170w_{1}^{\omega}-238y_{1}^{\omega}+150w_{2}^{\omega}-210y_{2}^{\omega}+36w_{3}^{\omega}+10w_{4}^{\omega}\\ \mathrm{s.t.} & x_{1}+x_{2}+x_{3}\leq 500\\ & d_{1}^{\omega}x_{1}-y_{1}^{\omega}-w_{1}^{\omega}\geq 200 \quad \omega\in\Omega\\ & d_{2}^{\omega}x_{2}-y_{2}^{\omega}-w_{2}^{\omega}\geq 240 \quad \omega\in\Omega\\ & w_{3}^{\omega}\leq 6000 \quad \omega\in\Omega\\ & d_{3}^{\omega}x_{3}-w_{3}^{\omega}-w_{4}^{\omega}\geq 0 \quad \omega\in\Omega\\ & x_{i}\geq 0 \quad \forall i=1,2,3 \quad \omega\in\Omega\\ & w_{i}^{\omega}\geq 0 \quad \forall i=1,\ldots,4 \quad \omega\in\Omega\\ & y_{i}^{\omega}\geq 0 \quad \forall i=1,2 \quad \omega\in\Omega \end{array}$$

#### (d) Solve RP.

The RP optimal value is \$108,390, and for this we grow 170 acres of wheat, 80 acres of corn and 250 acres of sugar beets.

#### (e) Calculate the EVPI and VSS.

$$EVPI = RPObj - WSObj = 7015.6$$

VSS = RPObj - EEV = 5500

EEV means the objective value by plugging into RP objective function the optimal X  $(x_i \forall i = 1, 2, 3)$  obtained in EV solution, leaving other stochastic variables  $(y_i, w_i)$  optimal in terms of RP.

#### (f) Do you think RP providing a good solution in this study? Why?

Yes. Although EVPI shows that RP is still not good enough because it has a \$7015 gap from the value of perfect information, it could be observed that VSS is 5500, meaning the profit value of stochastic solution is \$5500; ignoring the randomness/uncertainty and using EV solution instead is likely to lead to a loss of \$5500, which proves that RP is still valuable in this study.

# (g) For continuous scenarios, calculate the objective function's CI of lower bound and upper bound.

For the lower bound, we do N=30 sampling of scenarios and optimize once, and then repeat the sampling + optimization process for M=15 times, the resulting 15 optimal values  $\hat{z}_N^{\jmath}$  are: [1096275.45, 1214004.26, 1135037.49, 1108265.08, 1166365.27, 1121675.29, 1166806.31, 1113645.22, 1133085.4, 1099287.67, 1122861.44, 1155390.26, 1112180.73, 1129131.47, 1121738.34And we save the sampled scenarios (the N\*M=450 sampled yield rates) and the M=15optimal solutions  $(x_N^*)^j \forall j \in 1...M$  for the upper bound calculation. For the upper bound, since  $N = \overline{N} = 30$  and M = T = 15, I do not do optimization and only plug in the results saved in lower-bound part. For each batch j within M, we have a  $(x_N^*)^j$  and a set of 30 sampled yield rates; pairing the  $(x_N^*)^j$  with 1 sampled yield rate give us 1 optimal value (see XDgetObj() in the program, where X corresponds to  $(x_N^*)^j$  and D corresponds to the tons per acre stats given the sampled yield-rate). For each batch, 30 optimal values are generated and averaged as  $\hat{z}_{\bar{N}}^t$ ; and the resulting 15 optimal values  $\hat{z}_{\bar{N}}^t$ are: [125260.72, 147009.66, 131054.53, 130200.1, 138258.61, 129572.14, 138057.32, 128708.2, 130803.12, 126935.4, 132856.75, 137515.51, 129252.96, 130671.51, 129591.84]. By now we get 2 distributions for each bound. Calculate its mean and sample variance gives us the confidence intervals for both bounds.

Lower Bound CI: [1133049.98 - 15773.73, 1133049.98 + 15773.73]

Upper Bound CI: [132383.23 - 2832.50, 132383.23 + 2832.50]

## Problem 2: Decision Analysis and Value of Information (55%)

- (a) 1 decision node; 3 branches.
- (b) 3 chance nodes; 2 branches (low/high demand).
- (c) Draw the decision tree.

(d) Solve the decision tree.

Strategy A: 
$$P(\theta = 1) \times P(A, \theta = 1) + P(\theta = 0) \times P(A, \theta = 0) = 0.41 \times 1,000,000 + 0.59 \times (-400,000) = 174,000$$

Strategy B:  $0.41 \times 600,000 + 0.59 \times 300,000 = 423,000$ 

Strategy C:  $0.41 \times 100,000 + 0.59 \times 400,000 = 277,000$ 

- $\therefore$  Strategy B is the best production strategy given no extra information.
- (e) Calculate the joint probabilities.

$$P(X = 1, \theta = 1) = P(\theta = 1) \times P(X = 1 | \theta = 1) = 0.328$$
  
 $P(X = 0, \theta = 1) = P(\theta = 1) \times P(X = 0 | \theta = 1) = 0.082$   
 $P(X = 0, \theta = 0) = 0.413$   
 $P(X = 1, \theta = 0) = 0.177$ 

(f) Calculate the marginal probabilities.

$$P(X = 0) = \sum_{i=1}^{2} P(X = 0 | \theta = i)(\theta = i) = 0.2 \times 0.41 + 0.7 \times 0.59 = 0.495$$
$$P(X = 1) = \sum_{i=1}^{2} P(X = 1 | \theta = i)(\theta = i) = 0.8 \times 0.41 + 0.3 \times 0.59 = 0.505$$

(g) Calculate the posterior probabilities.

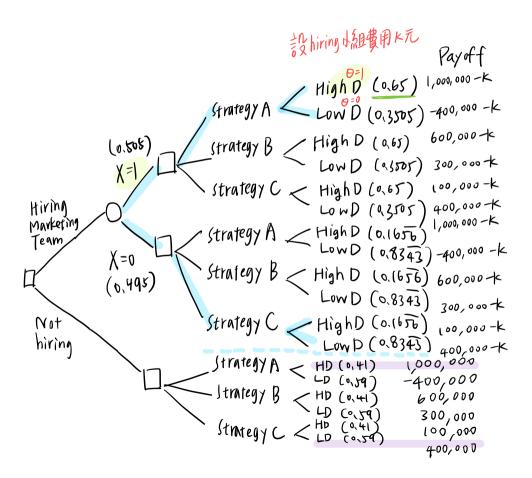
$$P(\theta = 0|X = 0) = P(\theta = 0, X = 0)/P(X = 0) = \frac{0.413}{0.495} = 0.83\overline{43}$$

$$P(\theta = 1|X = 0) = 0.16\overline{56}$$

$$P(\theta = 0|X = 1) \approx 0.3505$$

$$P(\theta = 1|X = 1) \approx 0.65$$

(h) Redraw the revised decision tree.



(i) Calculate the EVPI (Expected Value of Perfect Information).

$$ERofstratA: 1,000,000 \times 0.41 + (-400,000) \times 0.59 = 174,000$$
  
 $ERofstratB: 600,000 \times 0.41 + 300,000 \times 0.59 = 423,000$   
 $ERofstratC: 100,000 \times 0.41 + 400,000 \times 0.59 = 277,000$   
 $ERw/o = \max\{ER_A, ER_B, ER_C\} = 423,000$   
 $ERPI = 1,000,000 \times 0.41 + 400,000 \times 0.59 = 646,000$   
 $EVPI = ERPI - ERw/o = 223,000$ 

(j) Calculate the EVE when we directly use the marketing results with the assumption that if X = 1 we go for strategy A, otherwise strategy C. Note that although the revised decision tree in (h) marks the hiring fee K in payoffs, the below EVE does not take K into account.

$$EMV(StrategyA|X=1) \approx 0.65 \times 1,000,000 + 0.3505 \times (-400,000) = 510,000$$
  
 $EMV(StrategyC|X=0) \approx 0.1656 \times 1,000,000 + 0.8343 \times 400,000 = 348,560$   
 $ERE = \Sigma_{x \in X} P(X=x) \times EMV(DecisionRule|X=x)$   
 $= P(X=1) \times EMV(StrategyA|X=1) + P(X=0) \times EMV(StrategyC|X=0) = 430,087.$   
 $EVE = ERPI - ERw/o = 430,087 - 423,000 = 7,087$ 

(k) If the marketing team costs NTD 50,000, should we hire the team? No, because EVE = 7,087 < 50,000.