

This is a example of repeated two-stage SP.

I. Import all the needed data.

```
In[616]:= (* Definition of functions to work on simulation part. *)
wData =
  Import["wt_data.csv", "CSV", Path → NotebookDirectory[], "HeaderLines" → 1];
solarRadi = Import["solar.txt", "Table", Path → NotebookDirectory[]];
markovChainMatrix = {{0.7, 0.2, 0.1}, {0.6, 0.3, 0.1}, {0.5, 0.4, 0.1}};
stateProb = markovChainMatrix[[1]].MatrixPower[markovChainMatrix, 10];
randomStateSequence =
  RandomChoice[stateProb → {"N", "A", "M"}, Dimensions[wData][[1]]];
(* Extract wind and time data *)windSpeed = wData[[All, 20]] / 10 * 0.44704;
month =
  DateString[{wData[[10, 1]], {"Year", "Month", "Day", " ", "Hour", ":", "Minute"}},
  "Month"] // ToExpression;

(* Define Price of buying and selling. *)
BuyPrice[t_] := (
  If[7 ≤ Mod[t, 24] < 11 || 17 < Mod[t, 24] ≤ 21,
    0.099, If[11 ≤ Mod[t, 24] ≤ 17, 0.081,
    0.051]]
);
SellPrice[t_] := 0.8 * BuyPrice[t];

(* Initialize stages, currently two stages. *)
stageSize = 2;
availableResources = Table[0, {i, stageSize}];
demand = Table[0, {i, stageSize}];

(* Initial values to parameters. *)
airDensity = 1.27;
windTurbineCoefficientFactor = 0.5;
windTurbineRadius = 5;
solarRadiationFactor = 1.2;
solarPanelSize = 100;
initBatt = 100;
t = 100;
capBat = 100;

(* Function of Available Resources at time
t: electricity power from wind energy and solar energy *)
AvailableResource[t_] := (
  0.5 * windTurbineCoefficientFactor *
  windTurbineRadius^2 * airDensity * Pi * windSpeed[[t]]^3 +
  solarRadiationFactor * solarPanelSize * solarRadi[[Mod[t, 24] + 1, month]]
);
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(* Function of Local Demand at time
t: pick a random integer from 1000 to 10000 *)
Demand[t_] := (
  (*If[t==18,100000,AvailableResource[t]+1000]*)
  2000
  (*RandomInteger[{1000,10000}]*)
);

(* Function of unit cost of reserving
electricity in battery : set it constant *)
ReserveCost[t_] := (0.02);
(* Function of unit cost of transiting
electricity to or from battery : set it constant *)
TransitionCost[t_] := (0.01);

(* Function of optimization of simple two-stage *)
StageMinimize[t_, initBatt_] := (
  Minimize[
  {
    (xGB + xGC) * BuyPrice[t] +
    (initBatt + xGB + xRB - xBC - xBG) * ReserveCost[t] +
    (initBatt + xGB + xRB + xBC + xBG) * TransitionCost[t] -
    (xBG + xRG) * SellPrice[t] +

    If[randomStateSequence[[t]] == "N", markovChainMatrix[[1, 1]],
      If[randomStateSequence[[t]] == "A", markovChainMatrix[[2, 1]],
        markovChainMatrix[[3, 1]]]] * (
        (yGB1 + yGC1) * BuyPrice[t+1] +
        ((initBatt + xGB + xRB - xBC - xBG) + yGB1 + yRB1 - yBC1 - yBG1) *
        ReserveCost[t+1] +
        ((initBatt + xGB + xRB - xBC - xBG) + yGB1 + yRB1 + yBC1 + yBG1) *
        TransitionCost[t+1] -
        (yBG1 + yRG1) * SellPrice[t+1]) +

    If[randomStateSequence[[t]] == "N", markovChainMatrix[[2, 1]],
      If[randomStateSequence[[t]] == "A", markovChainMatrix[[2, 2]],
        markovChainMatrix[3, 2]]]] * (
        (yGB2 + yGC2) * BuyPrice[t+1] +
        ((initBatt + xGB + xRB - xBC - xBG) + yGB2 + yRB2 - yBC2 - yBG2) *
        ReserveCost[t+1] +
        ((initBatt + xGB + xRB - xBC - xBG) + yGB2 + yRB2 + yBC2 + yBG2) *
        TransitionCost[t+1] -
        (yBG2 + yRG2) * SellPrice[t+1]) +

    If[randomStateSequence[[t]] == "N", markovChainMatrix[[3, 1]],
      If[randomStateSequence[[t]] == "A", markovChainMatrix[[3, 2]],
        markovChainMatrix[[3, 3]]]] * (
        (yGB3 + yGC3) * BuyPrice[t+1] +
        ((initBatt + xGB + xRB - xBC - xBG) + yGB3 + yRB3 - yBC3 - yBG3) *
        ReserveCost[t+1] +

```

```

((initBatt + xGB + xRB - xBC - xBG) + yGB3 + yRB3 + yBC3 + yBG3) *
TransitionCost[t + 1] -
(yBG3 + yRG3) * SellPrice[t + 1]),

xBC + xGC + xRC == Demand[t] &&
0 ≤ initBatt + xRB + xGB - xBG - xBC ≤ capBat &&
xRG + xRB + xRC == AvailableResource[t] &&
xGB ≥ 0 && xGC ≥ 0 && xRB ≥ 0 && xRC ≥ 0 && xRG ≥ 0 && xBC ≥ 0 && xBG ≥ 0 &&

yBC1 + yGC1 + yRC1 == Demand[t + 1] &&
-(initBatt + xGB + xRB - xBC - xBG) ≤
yRB1 + yGB1 - yBG1 ≤ capBat - (initBatt + xGB + xRB - xBC - xBG) &&
yRG1 + yRB1 + yRC1 == AvailableResource[t + 1] &&
yGB1 ≥ 0 && yGC1 ≥ 0 && yRB1 ≥ 0 && yRC1 ≥ 0 && yRG1 ≥ 0 && yBC1 ≥ 0 && yBG1 ≥ 0 &&

yBC2 + yGC2 + yRC2 == Demand[t + 1] &&
-(initBatt + xGB + xRB - xBC - xBG) ≤
yRB2 + yGB2 - yBG2 ≤ capBat - (initBatt + xGB + xRB - xBC - xBG) &&
yRG2 + yRB2 + yRC2 == AvailableResource[t + 1] / 2 &&
yGB2 ≥ 0 && yGC2 ≥ 0 && yRB2 ≥ 0 && yRC2 ≥ 0 && yRG2 ≥ 0 && yBC2 ≥ 0 && yBG2 ≥ 0 &&

yBC3 + yGC3 + yRC3 == Demand[t + 1] &&
-(initBatt + xGB + xRB - xBC - xBG) ≤
yRB3 + yGB3 - yBG3 ≤ capBat - (initBatt + xGB + xRB - xBC - xBG) &&
yRG3 + yRB3 + yRC3 == AvailableResource[t + 1] / 4 &&
yGB3 ≥ 0 && yGC3 ≥ 0 && yRB3 ≥ 0 && yRC3 ≥ 0 && yRG3 ≥ 0 && yBC3 ≥ 0 && yBG3 ≥ 0
},
{xGB, xGC, xRB, xRC, xRG, xBC, xBG, yGB1, yGC1, yRB1, yRC1, yRG1, yBC1, yBG1, yGB2,
yGC2, yRB2, yRC2, yRG2, yBC2, yBG2, yGB3, yGC3, yRB3, yRC3, yRG3, yBC3, yBG3}]
);

```

2. Run it once and get the result of the optimized first stage.

```

In[641]:= firstStage = StageMinimize[t, initBatt]
Out[641]= {17.9696, {xGB → 0., xGC → 0., xRB → 0., xRC → 2000., xRG → 364.14,
xBC → 0., xBG → 100., yGB1 → 0., yGC1 → 0., yRB1 → 0., yRC1 → 2000.,
yRG1 → 295.286, yBC1 → 0., yBG1 → 0., yGB2 → 0., yGC2 → 852.357, yRB2 → 0.,
yRC2 → 1147.64, yRG2 → 0., yBC2 → 0., yBG2 → 0., yGB3 → 0., yGC3 → 1426.18,
yRB3 → 0., yRC3 → 573.822, yRG3 → 0., yBC3 → 1.13687 × 10-13, yBG3 → 0.}}

```

3. Reset the battery amount

```

In[642]:= initBatt = N[(xRB /. firstStage[[2]]) + (xGB /. firstStage[[2]]), 2]
Out[642]= 0.

```

4. Run it again, scenario at time t+1 is already simulated in randomStateSequence.

```
In[643]:= secondStage = StageMinimize[t + 1, initBatt]
Out[643]= {41.9686, {xGB → 0., xGC → 0., xRB → 0., xRC → 2000., xRG → 295.286, xBC → 0., xBG → 0.,
yGB1 → 0., yGC1 → 0., yRB1 → 0., yRC1 → 2000., yRG1 → 295.286, yBC1 → 0., yBG1 → 0.,
yGB2 → 0., yGC2 → 852.357, yRB2 → 0., yRC2 → 1147.64, yRG2 → 0., yBC2 → 0., yBG2 → 0.,
yGB3 → 0., yGC3 → 1426.18, yRB3 → 0., yRC3 → 573.822, yRG3 → 0., yBC3 → 0., yBG3 → 0.}}}

$MachinePrecision
15.9546

$MachineEpsilon
2.22045 × 10-16
```

A repeated two-stage example.

```
In[644]:= Table[StageMinimize[t, initBatt][[1]], {t, 1, 10, 1}]
(* ignore the initial battery amount change at each step *)

NMinimize::incst :
NMinimize was unable to generate any initial points satisfying the inequality constraints {-2000. + 1.xBC + 1.xGC <= 0, 356.771
- 3.33067*10^-16 xBC - xBG + xGB + 1.xGC - 1.xRG <= 0, -456.771 - 1.xBC - 1.xGC + 1.xRG <= 0, <<10>>, 1870.4
+ 1.yGC3 - 1.yRB3 - 1.yRG3 <= 0, -3870.4 + 1.yRB3 + 1.yRG3 <= 0, -2327.17 + 3.33067*10^-16 xBC + xBG - xGB - 1.
xGC + 1.xRG + yBG3 - yGB3 - 1.yGC3 + 1.yRG3 <= 0}. The initial region specified may not
contain any feasible points. Changing the initial region or specifying explicit initial points may provide a better solution. >>

NMinimize::nnum : The function value 90.8946 + 70.8838 {{0.7, 0.2, 0.1}, {0.6, 0.3, 0.1}, {0.5, 0.4, 0.1}}[3, 2] is not a number at
{xBC, xBG, xGB, xGC, xRB, xRC, xRG, yBC1, yBC2, yBC3, yBG1, yBG2, yBG3, yGB1, yGB2, yGB3, yGC1, yGC2, yGC3, yRB1, yRB2,
yRB3, yRC1, yRC2, yRC3, yRG1, yRG2, yRG3} =
{0.0282287, 1.97318, 0.0367799, 0.0107591, 456.805, 1999.96, 0.00467042, -13479.6, -5738.82, -1868.44, 0.03725,
0.0827363, 0.0155209, <<21>>, <<20>>, <<21>>, 0.0295334, 0.0288056, 0.00178635, 0.0463451, 0.0600338, 0.00815288,
15479.6, 7738.79, 3868.44, 1.96662, 1.95585, 1.95572}. >>

Out[644]= {32.8356, 42.5504, 48.1138, 51.4377, 33.2892,
47.4933, {0.099 (xGB + xGC) + 0.02 (0. - xBC - xBG + xGB + xRB) +
0.01 (0. + xBC + xBG + xGB + xRB) - 0.0792 (xBG + xRG) +
0.5 (0.099 (yGB1 + yGC1) + 0.02 (0. - xBC - xBG + xGB + xRB - yBC1 - yBG1 + yGB1 + yRB1) +
0.01 (0. - xBC - xBG + xGB + xRB + yBC1 + yBG1 + yGB1 + yRB1) - 0.0792 (yBG1 + yRG1)) +
0.1 (0.099 (yGB3 + yGC3) + 0.02 (0. - xBC - xBG + xGB + xRB - yBC3 - yBG3 + yGB3 + yRB3) +
0.01 (0. - xBC - xBG + xGB + xRB + yBC3 + yBG3 + yRB3) - 0.0792 (yBG3 + yRG3)) +
(0.099 (yGB2 + yGC2) + 0.02 (0. - xBC - xBG + xGB + xRB - yBC2 - yBG2 + yGB2 + yRB2) +
0.01 (0. - xBC - xBG + xGB + xRB + yBC2 + yBG2 + yRB2) - 0.0792 (yBG2 + yRG2)) +
{{0.7, 0.2, 0.1}, {0.6, 0.3, 0.1}, {0.5, 0.4, 0.1}}[3, 2],
xBC + xGC + xRC == 2000 && 0 <= 0. - xBC - xBG + xGB + xRB <= 100 &&
xRB + xRC + xRG == 2456.77 && xGB >= 0 && xGC >= 0 && xRB >= 0 &&
xRC >= 0 && xRG >= 0 && xBC >= 0 && xBG >= 0 && yBC1 + yGC1 + yRC1 == 2000 &&
0. + xBC + xBG - xRB <= -yBC1 - yBG1 + yRB1 <= 100. + xBC + xBG - xGB - xRB &&
yRB1 + yRC1 + yRG1 == 15481.6 && yGB1 >= 0 && yGC1 >= 0 && yRB1 >= 0 &&
yRC1 >= 0 && yRG1 >= 0 && yBC1 >= 0 && yBG1 >= 0 && yBC2 + yGC2 + yRC2 == 2000 &&
0. + xBC + xBG - xRB <= -yBC2 - yBG2 + yRB2 <= 100. + xBC + xBG - xGB - xRB &&
yRB2 + yRC2 + yRG2 == 7740.81 && yGB2 >= 0 && yGC2 >= 0 && yRB2 >= 0 &&
yRC2 >= 0 && yRG2 >= 0 && yBC2 >= 0 && yBG2 >= 0 && yBC3 + yGC3 + yRC3 == 2000 &&
0. + xBC + xBG - xRB <= -yBC3 - yBG3 + yRB3 <= 100. + xBC + xBG - xGB - xRB &&
yRB3 + yRC3 + yRG3 == 3870.4 && yGB3 >= 0 && yGC3 >= 0 && yRB3 >= 0 && yRC3 >= 0 &&
yRG3 >= 0 && yBC3 >= 0 && yBG3 >= 0}, -2522.46, -4440.23, -4362.97}
```

The example shows above is the example of generating repeated two-stage in 10 steps. But in the one of the step, it cannot get the optimized solution.

The result is short for like this:

{32.8356, 42.5504, 48.1138, 51.4377, 33.2892, 47.4933, ***, -2522.46, -4440.23, -4362.97}

Also notice in two-stage the result for the first step contains one optimized variable like {yBC3->1.13687*10^-13}, which is obvious quite small, and such kind of variable value only appears in

Battery to Consumer (BC).