

Johns Hopkins Stochastic Multi-stage Integrated Network Expansion (JHSMINE) Version 1

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July 2017

1 Introduction

In this document, the basic JHSMINE formulation will be shown. This whole formulation is a result of model development across multiple articles/reports. This is thus a combination of works of researchers from Hobbs group. The original formulation with two-stage stochastic programming was from [1]. Then in [2], this formulation was at the first time applied to WECC with DC OPF model enhancement. Details of a subsequent application that includes linearized unit commitment constraints [3] are in [4].

[1] A. H. van der Weijde, B. F. Hobbs, "The economics of planning electricity transmission to accommodate renewables: Using two-stage optimisation to evaluate flexibility and the cost of disregarding uncertainty," *Energy Economics*, vol. 34, no. 6, pp. 2089-2101, 2012.

[2] F. D. Munoz, B. F. Hobbs, J. L. Ho, S. Kasina, "An Engineering-economic approach to transmission planning under market and regulatory uncertainties: WECC case study," *IEEE Transactions on Power Systems*, col. 29, no. 1, pp. 307-317, 2014.

[3] S. Kasina, S. Wogrin and B. Hobbs, "Approximations to unit comment in planning models," *INFORMS Annual Meeting*, Minneapolis, 2013.

[4] J. Ho, B. F. Hobbs, P. Donohoo-Vallett, Q. Xu et al., "Planning transmission for uncertainty: Applications and lessons for the western interconnection," *WECC*, Salt Lake City, UT, 2016.

2 Formulation

2.1 Set

2.1.1 Root Set

- B : Bus set. Index: b, i
- G : Generation type set. Index: g
- H : Model stage set. Index: h
- J : State set. Index: j
- L : Line set. Index: l
- P : Period set. Index: t
- $Path$: Path set. Index: u
- RP : REC trading path set. Index: p
- S : Scenario set. Index: s

2.1.2 Subset

- B_C : Conventional hub set
- B_E : Existing buse set
- B_W : Renewable energy hub set
- G_D : Generation types to be dispatched
- G_P : Generation types modeled as parameters
- G_E : Existing generation types
- G_I : Generation types to be invested
- G_R : Renewable generation types
- L_{EXA} : Existing AC Lines
- L_{EXD} : Existing DC lines
- L_{CFB} : First stage backbone reinforcement candidate lines
- L_{CSB} : Second stage backbone reinforcement candidate lines
- L_{CBR} : First stage renewable access candidate lines
- L_{CWR} : Second stage renewable access candidate lines
- L_{EQ} : Equivalent lines
- L_H : Unidirectional fictitious hub lines, connecting conventional hubs to the grid

2.2 Parameters

2.2.1 Universal Parameters

- $A_{l,h}$: Stage availability of candidate line l , for first-stage candidates, 1 for year 10 and 20; for second-stage candidates, 1 for only year 20
- ACP_j^h : Alternate compliance payment (ACP) rate, Million\$/GWh
- B_l : Susceptance of line l , GW
- CX_l : Capital cost of line, Million\$
- EM_g : Emission rate, ton/MMBTU
- \overline{F}_l : Line thermal capacity, GW
- FOM_g : Fixed O&M cost Million\$/(GW year)
- FOR_g : Forced outage rate
- HW_t : Hour-weight of t
- $HR_{g,b}$: Heat rate of generation g on bus b , GW \$/MMBTU
- $IRPS_j$: Instate RPS requirement
- M_l : Large positive number for AC candidate line l , GW
- POR_g : Planed Outage Rate
- $PW_{b,j}$: Population allocation weight per bus to each state
- \overline{R}_u : Existing Path rating, GW

- \overline{RX}_l : Expansion of path rating with candidate line l , non-zero for backbone reinforcement
- V_h : Number of years for stage h
- $VOLL$: Value of load loss, Million\$/GWh
- $VOM_{g,b}$: Variable O&M cost Million\$/GWh
- $W_{b,g,t}$: Hourly capacity factors for wind, solar and hydro, 1 for other techs
- $Y_{b,g}^0$: Existing Capacity, GW
- $\overline{YMax}_{b,g}$: Maximum resource potential at bus under investment, GW
- $YR_{b,g}^h$: Cumulative forced retirement of generation capacity in stage h
- δ : Discount Rate
- $\Phi_{l,b}$ Element of line-node incidence matrix, 1 for to-bus, -1 for from-bus, otherwise 0
- $\Psi_{u,l}$ Element of path-line incidence matrix, 1 for to-bus, -1 for from-bus, otherwise 0
- $\Omega_{p,j}$: Element of REC trading path-state incidence matrix, binary

2.2.2 Scenario Specific Parameters

- p_s : Probability of scenario s
- $CTax_s$: Carbon tax per scenario, \$/ton
- $CY_{b,g,s}^h$: Capital cost of generation, Million\$/GW
- $D_{b,t,s}^h$: Forecasted demand, GW
- $FP_{b,g,s,t}^h$: Fuel price of generation g on bus b , Million \$/MMBTU
- $MC_{b,g,s,t}^h$: Generation marginal cost, Million\$/GW
- $RPS_{j,s}^h$: Renewable obligation of state j , %
- $WRPS_s$: Region-wise RPS renewable obligation, %

2.2.3 Calculating $MC_{g,s,t}^h$

$$MC_{g,s,t}^h = FP_{b,g,s,t}^h HR_{g,b} + CTax_s HR_{g,b} EM_g + VOM_{g,b} \quad (1)$$

2.3 Decision Variables

2.3.1 Investment Decision Variables

- x_l^{CFB} : Backbone reinforcement first stage decision, binary, defined on L_{CFB}
- $x_{l,s}^{CSB}$: Backbone reinforcement recourse decision, binary, defined on L_{CSB}
- x_l^{CFR} : Renewable access first stage investment decision, continuous 0-1, defined on L_{CFR}
- $x_{l,s}^{CSR}$: Renewable access investment recourse decision, continuous 0-1, defined on L_{CSR}
- $y_{b,g}$: Generation expansion anticipation, GW, positive, defined on $B_C \cup B_W, G_I$
- $y_{b,g,s}$: Generation expansion recourse anticipation, GW, positive, defined on $B_C \cup B_W, G_I$

2.3.2 Operation Decision Variables

- $f_{l,t,s}^h$: Power flow, GW, unrestricted
- $k_{b,g,t,s}^h$: Generation, GW, positive
- $n_{j,s}^h$: Noncompliance of renewable target, GWh, positive
- $q_{s,p}^h$: Renewable energy credit trading, GWh, positive
- $r_{b,t,s}^h$: Load curtailment, positive
- $\theta_{b,t,s}^h$: Phase angle, unrestricted
- $\phi_{b,t,s}^h$: Load uplift, GW

2.4 Objection Function

$$I_s^0 = \sum_{l \in L_{CFB} \cup L_{CFR}} CX_l x_l + \sum_{g \in G_I} CY_{b,g,s}^0 y_{b,g} \quad (2)$$

$$I_s^1 = \sum_{l \in L_{CSB} \cup L_{CSR}} CX_l x_{l,s} + \sum_{g \in G_I} CY_{b,g,s}^1 y_{b,g,s} \quad (3)$$

$$OC_s^h = \sum_{v=1}^{V_h} \left(\frac{1}{1+\delta} \right)^{v-1} 8760 \sum_{t \in P} \sum_{g \in G} MC_{g,s,t}^h HW_t k_{b,g,t,s}^h \quad (4)$$

$$OP_s^h = \sum_{v=1}^{V_h} \left(\frac{1}{1+\delta} \right)^{v-1} \left[\sum_{b \in B} 8760 VOL_{LLHW}_t (r_{b,t,s}^h + \phi_{b,t,s}^h) + \sum_{j \in J} ACP_{j,s}^h n_{j,s}^h \right] \quad (5)$$

$$OM_s^1 = \sum_{b,g} FOM_g [Y_{b,g}^0 - YR_{b,g}^1 + y_{b,g}] \quad (6)$$

$$OM_s^2 = \sum_{b,g} FOM_g [Y_{b,g}^0 - YR_{b,g}^2 + y_{b,g} + y_{b,g,s}] \quad (7)$$

$$O_s^h = OC_s^h + OP_s^h + OM_s^h \quad (8)$$

$$\min I^0 + \sum_{s \in S} p_s \left[\left(\frac{1}{1+\delta} \right)^{V_1} (I_s^1 + O_s^1) + \left(\frac{1}{1+\delta} \right)^{V_1+V_2} O_s^2 \right] \quad (9)$$

2.5 Constraints

2.5.1 RPS Constraint

Region-wise RPS:

$$\begin{aligned} \sum_{j \in J} \sum_{g \in G_{R,t,b}} 8760 HW_t PW_{b,j} k_{b,g,t,s}^h + n_{j,s}^h \\ \geq WRPS_s \sum_{j \in J} \sum_{i,t} 8760 HW_t PW_{b,j} [D_{b,t,s}^h - r_{b,t,s}^h + \phi_{lo,b,t,s}^h] \quad \forall s, h \end{aligned} \quad (10)$$

State-wise RPS:

$$\begin{aligned} \sum_{g \in G_{R,t,b}} 8760 HW_t PW_{b,j} k_{b,g,t,s}^h - \sum_p [\Omega_{p,j} q_{s,p}^h] + n_{j,s}^h \\ \geq RPS_{j,s}^h \sum_{i,t} 8760 HW_t PW_{b,j} [D_{b,t,s}^h - r_{b,t,s}^h + \phi_{lo,b,t,s}^h] \quad \forall s, h, j \end{aligned} \quad (11)$$

In-State RPS:

$$\begin{aligned} \sum_{g \in G_{R,t,b}} 8760 HW_t PW_{b,j} k_{b,g,t,s}^h - \sum_p [\Omega_{p,j}^{>0} q_{s,p}^h] + n_{j,s}^h \\ \geq RPS_{j,s}^h IRPS_j \sum_{i,t} 8760 HW_t PW_{b,j} [D_{b,t,s}^h - r_{b,t,s}^h + \phi_{lo,b,t,s}^h] \quad \forall s, h, j \end{aligned} \quad (12)$$

2.5.2 Transmission Constraint: KCL Component

Kirchhoff's Current Law:

$$\sum_g k_{b,g,t,s}^h + r_{b,t,s}^h + \sum_l \Phi_{l,b} f_{l,t,s}^h - \phi_{lo,b,t,s}^h - D_{b,t,s}^h = 0 \quad \forall b, t, s, h \quad (13)$$

Path Ratings:

$$\left| \sum_l \Psi_{u,l} f_{l,t,s}^h \right| \leq \left[\overline{R}_u + \sum_l A_{h,l} \overline{RX}_l (x_l + x_{l,s}) \right] \quad \forall s, h, u, t \quad (14)$$

Load Curtailment Limits:

$$r_{b,t,s}^h \leq D_{b,t,s}^h \quad \forall b, t, s, h \quad (15)$$

Thermal Limits for Existing AC & DC lines:

$$|f_{l,t,s}^h| \leq \overline{F}_l \quad \forall l \in L_{EXA} \cup L_{EXD}, t, s, h \quad (16)$$

Thermal Limits for Candidate Lines:

$$|f_{l,t,s}^h| \leq \overline{F}_l A_{h,l} (x_l + x_{l,s}) \quad \forall l, t, s, h \quad (17)$$

Hub Line Flow Non-negativity:

$$f_{l,t,s}^h \geq 0 \quad \forall l \in L_H, t, s, h \quad (18)$$

Equivalent Line Thermal Capacity (For Pipe and Bubble formulation):

$$|f_{l,t,s}^h| \leq \frac{\pi}{6} |B_l| \quad \forall l \in L_{EQ} \quad (19)$$

2.5.3 Transmission Constraint: KVL Component

Swing Bus:

$$\theta_{l',t,s}^h = 0 \quad \forall t, s, h \quad (20)$$

Kirchhoff's Voltage Law for Existing AC lines and Equivalent lines:

$$B_l \sum_b -1 \Phi_{l,b} \theta_{b,t,s}^h = f_{l,t,s}^h \quad \forall l \in L_{EXA} \cup L_{EQ} \quad (21)$$

Kirchhoff's Voltage Law for First Stage Backbone Candidates:

$$|B_l \sum_b -1 \Phi_{l,b} \theta_{b,t,s}^h - f_{l,t,s}^h| \leq M_l (1 - x_l) \quad \forall l \in L_{CFB}, t, s, h \quad (22)$$

Kirchhoff's Voltage Law for Second Stage Backbone Candidates:

$$|B_l \sum_b -1 \Phi_{l,b} \theta_{b,t,s}^2 - f_{l,t,s}^2| \leq M_l (1 - x_{l,s}) \quad \forall l \in L_{CSB}, t, s \quad (23)$$

Phase Angle Difference Limit:

$$\left| \sum_b \Phi_{l,b} \theta_{b,t,s}^h \right| \leq \frac{\pi}{6} \quad \forall l \in L_{EQ}, t, s, h \quad (24)$$

2.5.4 Generation Constraints

Generation Investment Potential:

$$y_{b,g} + y_{b,g,s} \leq \overline{YMAX}_{b,g} \quad \forall b, g, s \quad (25)$$

Invested Generation Limit Year 10:

$$k_{b,g,t,s}^1 \leq (1 - POR_g)(1 - FOR_g) W_{b,g,t} y_{b,g} \quad \forall b \in B_W \cup B_C, g \in G_I, t, s \quad (26)$$

Invested Generation Limit Year 20:

$$k_{b,g,t,s}^2 \leq (1 - POR_g)(1 - FOR_g) W_{b,g,t} (y_{b,g} + y_{b,g,s}) \quad \forall b \in B_W \cup B_C, g \in G_I, t, s \quad (27)$$

Existing Parameterized Generation:

$$k_{b,g,t,s}^h = (1 - POR_g)(1 - FOR_g) W_{b,g,t} (Y_{b,g}^0 - Y R_{b,g}^h) \quad \forall b, g \in G_P, t, s, h \quad (28)$$

Existing Dispatchable Generation:

$$k_{b,g,t,s}^h \leq (1 - POR_g)(1 - FOR_g) W_{b,g,t} (Y_{b,g}^0 - Y R_{b,g}^h) \quad \forall b, g \in G_D \cap G_E, t, s, h \quad (29)$$