

1 *Article*

2 Duality Based Risk Mitigation Method for 3 Construction of Joint Hydro-Wind Coordination 4 Short-Run Marginal Cost Curves

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10 **Abstract:** This study analyses the short-run hydro generation scheduling for the wind power
11 differences from the contracted schedule. The approach for construction of the joint short-run
12 marginal cost curve for the hydro-wind coordinated generation is proposed and applied on the real
13 example. This joint short-run marginal cost (SRMC) curve is important for its participation in the
14 energy markets and for economic feasibility assessment of such coordination. The approach credibly
15 describes the short-run marginal costs which this coordination bears in “real life”. The approach is
16 based on the duality framework of a convex programming and as a novelty combines the shadow
17 price of risk mitigation capability and the water shadow price. The proposed approach is formulated
18 as a stochastic linear program and tested on the case of the Vinodol hydropower system and the
19 wind farm Vrataruša in Croatia. The result of the case study is a family of 24 joint short-run marginal
20 cost curves.

21 **Keywords:** Convex programming; Wind power, Hydropower; Risk mitigation; CVaR; Short-run
22 marginal cost curve
23

24 Nomenclature

Symbols

c'	Short-run marginal cost function (€/MW·h).
d	Difference between forecasted Y and actual wind generation y_w (MW).
d^+	Positive wind difference (MW).
d^-	Negative wind difference (MW).
e	Natural water inflow (MW).
F_α	Special function used for risk shaping of CVaR (€).
g	Net outflow of hydro generation (MW)
I	Hourly revenue (€).
k_{St}	Maximal capacity of reservoir (MW·h).
k_{Rm}	Parameter used for risk exposure reduction in risk shaping procedure (€).
k_{Tu}	Hydro turbine maximal capacity (MW).
k_{Tu}^w	Wind turbine maximal capacity (MW).
n_{St}	Minimal capacity of reservoir (MW·h).
n_{Tu}	Hydro turbine minimal capacity (MW).
n_{Tu}^w	Wind turbine minimal capacity (MW).
s	Energy stock, amount of water in reservoir in t , (MW·h).
s_0	Energy stock at the beginning of planning interval (MW·h)

s_T	Energy stock surplus or deficit at the end of planning interval (MWh)
y	Hydro generation (MW).
Y	Contracted wind generation (MW).
y_w	Actual wind generation (MW).
Greek	
α	Percentile used for the CVaR where $1-\alpha$ defines the worst events (%).
δ	Shadow prices associated with constraint of CVaR's helping variable η (€).
ε	Shadow prices associated with CVaR's hourly revenue constraint.
ζ	The decision variable which defines the Value at Risk (€).
η	Variable used for obtainment of the CVaR (€).
κ^{Tu}	Shadow price of hydro generation maximum capacity (€/MW·h).
κ^{St}	Shadow price of reservoir maximum capacity (€/MW·h).
λ	Shadow price of energy stock surplus/deficit at the end of operation (€/MW·h).
ν^{Tu}	Shadow price of hydro generation minimum capacity (€/MW·h).
ν^{St}	Shadow price of reservoir minimum capacity (€/MW·h).
ξ	Shadow price of risk mitigation capability (dimensionless).
π	Price of electricity (€/MW·h).
ψ	Shadow price of water (€/MW·h).
Spaces	
$[0, T]$	Planning interval, subspace of the real line $t \in [0, T] \subset \mathbb{R}$.

25 1. Introduction

26 In this paper the hydro-wind coordination is formulated as a hydro-economic river basin model
 27 (HERBM). The coordination assumes that hydro generation is scheduled for firming wind generation.
 28 In other words, the short-run hydro generation is scheduled for the wind power differences from the
 29 contracted schedule. This wind power difference from contracted schedule impacts the short-run
 30 marginal cost curve of the hydro generation curve in the coordination [1]. Generally, a short-run
 31 marginal cost curve of a hydro generation is obtained from the water shadow price and as such is
 32 important for economic feasibility assessment of the coordination. In this paper, the joint short-run
 33 marginal cost curve for electricity generation of hydro-wind coordinated generation is obtained. To
 34 obtain these joint short-run marginal curves, the primal problem and its dual are formulated as
 35 convex optimization problems. The primal problem is defined as a short-run revenue maximization
 36 problem, while the dual problem minimizes the usage costs of the limited resources (hydro and wind
 37 turbine capacity, reservoir capacity, water inflow resource, wind difference resource, risk mitigation
 38 capability).

39 This paper is based on the pioneering works [2-3] which systematically address the problem of
 40 the short run profit maximization of the hydro and the pumped storage units using continuous
 41 functions and [4] where method for the contraction of short-run marginal cost curves for hydro
 42 generation is given. These works are based on the ideas of conjugate duality and optimization [5].
 43 The issue of hydro-wind coordination is addressed extensively and among the most significant are
 44 the following papers. The sizing method for the pumped hydro storage which uses the wind power
 45 surplus is presented in [6]. A methodology for increasing profits of a generation company that owns
 46 wind and pumped-storage plants while accounting the wind power uncertainty is presented in [7].
 47 In [8] the problem of introduction of the new pumped-storage station to the existing hydropower
 48 system owned by a new subject is addressed. In [9] a combined strategy for bidding and operating in
 49 a power exchange is presented. It considers the combination of a wind generation company and a
 50 hydro-generation company. The [10] discusses the impact of joint bidding of wind power plant and

51 a hydro generating unit on the wind farm revenue in a pool-based electricity market, considering the
52 uncertainty of wind power prediction. The [11] proposes methodology that can reflect different risk
53 profiles of decision makers in wind-hydro-thermal coordination and in [12] a joint operation between
54 a wind farm and a hydro-pump plant is proposed to decrease costs of wind farm imbalances.

55 This paper will complement these studies by tackling the issue of contraction of joint short-run
56 marginal cost curves for the hydro-wind coordination. Obtaining a joint short-run marginal cost
57 curves for a hydro-wind coordination is hard issue due to facts that electricity generation from the
58 hydro-wind coordination is: a) storable and; b) has a negligible direct generation cost. Therefore,
59 usual approach (first derivative by output of the total cost function) for obtainment of short-run
60 marginal cost curves is not sufficient in this case. This issue was not tackled until the fundamental
61 works [4] where issue of constructing short-run marginal cost curve for a hydro producer is analyzed
62 and [1] where the impact of a wind power difference from contracted schedule on the water shadow
63 price is analyzed. This paper, as an extension of the research done in [1] and [4], contributes with the
64 systematic approach for construction of the joint short-run marginal cost curves for a hydro-wind
65 coordination.

66 Therefore, this research contributes with the approach based on duality method of convex
67 programming for construction of the joint short-run marginal cost curves for electricity generation of
68 a hydro-wind coordination which as a novelty combines: i) a shadow price of risk mitigation
69 capability, ξ ; ii) and a water shadow price, ψ . The approach enables quantification of hourly cost of
70 risk mitigation through the shadow price of risk mitigation capability, ξ . The proposed approach is
71 formulated as a stochastic linear program and is easy to implement in various optimization problems.
72 The approach is tested on the case study of Vinodol hydropower system and the wind farm Vratarašća
73 in Croatia resulting in a family of 24 joint short-run marginal cost curves. The cost of risk mitigation
74 is also provided. To implement risk mitigation, the CVaR risk measure is used, which enables
75 measurement and limitation of extreme financial losses. It is a coherent risk measure [14-18] which
76 means that it satisfies properties of monotonicity, sub-additivity, positive homogeneity and
77 translational invariance. For the risk measure which satisfies these properties it is said that it describes
78 well a real life occurring risks. The properties of sub-additivity and positive homogeneity can be
79 replaced by property of convexity which is important when implementing in convex optimization
80 problems in order not to undermine its convexity¹.

81 Besides the CVaR, the second important term is the *water shadow price*. The idea behind the water
82 shadow price is that generation of 1 MW·h in particular hour means not being able to produce that 1
83 MW·h in other future hours (it is important to notice that the water shadow price can also be regarded
84 as an opportunity cost of water generation in particular hour). Generally, the shadow price is equal
85 to the marginal utility of relaxing particular constraint or marginal cost when constraint is
86 strengthened. In this case, generation of 1 MW·h means strengthening water balance constraint by 1
87 MW·h, in particular hour. Therefore, by definition, a water shadow price can be regarded as a
88 marginal cost which makes it appropriate for construction of short-run marginal cost curves². In
89 fundamental works [20,21] the water shadow price is assumed to be constant over the planning
90 period $[0, T]$. For more realistic approach the water shadow price should change over the planning
91 period, such as in [1-4], every time when reservoir limits are reached, which is also assumed here.

92 In Chapter II, the short-run dual for valuing limited hydro-wind generation resources is set as
93 the double infinite linear programming problem. The dual is reformulated for shadow pricing of
94 water in the coordinated hydro-wind generation. The wind power difference from contracted
95 schedule and CVaR are implemented in the dual problem through the duality framework of convex

¹ See Corollary 11 in [18] for more about convexity of CVaR.

² For more about issue of shadow pricing of water, see [19] where hydro generation with constant head is analyzed.

96 programming. In the Chapter III cascaded hydropower system Vinodol is carefully modeled as the
 97 HERBM [22,23] and the wind farm Vrataruša power difference is implemented within it. The results
 98 are presented and discussed in the same Chapter. In the Chapter IV conclusions are given.

99 2. Construction of the joint short-run marginal cost curve

100 The primal problem is a short-run profit maximization problem shown in Eqs. (1) - (14). To
 101 achieve strong duality, the primal problem must be convex and needs to satisfy *Slater's condition*. The
 102 primal problem used here is a linear program, i.e. it is convex and it satisfies *Linearity constraint*
 103 *qualification* which is sufficient condition for strong duality. Strong duality is important here since it
 104 implies that the duality gap, i.e. difference between the primal and dual solutions is zero. The dual
 105 to the primal problem is shown in Eqs. (15) - (21) and is used for the construction of the joint short-
 106 run marginal cost curves for the hydro-wind coordination.

107 For hydro generation, it is assumed that minimal and maximal reservoir capacities are n_{st}
 108 and k_{st} (Eq. (6)) and are measured in terms of energy (MW·h) same as water stock measured which
 109 is stored at no cost. The natural water inflow e into the reservoir is measured over $[0, T]$ in MW.
 110 Wind power difference d is measured over $[0, T]$ in MW and can obtain positive d^+ and
 111 negative d^- values (Eq. (12)). The units are MW due to continuous-time dating (see Eq. (2) and Eq.
 112 (16)). It is defined as the difference between generated wind power and power indicated in contracted
 113 schedule. The hydro turbine operating range in Eq. (4) is limited by: its minimal and maximal
 114 capacity n_{tu} and k_{tu} measured in MW; the positive d^+ and the negative d^- wind difference. The
 115 performance curve of the hydro generation is considered linear and the head is fixed over the
 116 planning interval $[0, T] \in \mathbb{R}$. The goal function (Eq. (2)) maximizes the expected revenue obtained
 117 from day-ahead energy market over the planning interval $[0, T]$ which is multiplied with the
 118 probability $P(A)$ of event A . The y is the hydro generation measured in MW and π is the
 119 electricity price measured in €/MW·h since of continuous-time dating. The decision variables in Eq.
 120 (3), over which the goal function (Eq. (2)) is optimized, consist of the electricity generation variable
 121 y and (ζ, η) which are decision variables associated with CVaR risk measure.

122 According to the Theorem 14 in [18] the CVaR can be implemented in the optimization problem
 123 as a goal function, a constraint or both. Since the goal function is predefined here, then CVaR is
 124 implemented with Eq. (7) - (9). The risk mitigation is done through risk shaping of the special function
 125 F_α with the parameter k_{Rm} , according to the Theorem 16 in [18]. The k_{Rm} is measured in monetary
 126 units (€) and represents the minimum desired level of revenue the owner expect in worst $1 - \alpha$
 127 outcomes (usually 5%, where $\alpha = 95\%$) and is part of input data (Eq. (1)). The decision variable ζ in
 128 Eq. (3) defines the Value at Risk (VaR) measure and η is a variable used for determining hourly
 129 revenue in worst case events, both these are used for obtainment of the CVaR³. The electricity price
 130 π is expressed in €/MW·h. The s_0 defines the energy stock at the beginning of planning interval in
 131 MW·h and s_T energy stock surplus or deficit at the end of planning interval in MW·h. Both
 132 parameters are the result of the middle-term HERBM optimization and part of the input data (Eq.
 133 (1)). The input data is same for primal (Eq. (1)), and dual problem (Eq. (15)). The g in Eq. (10) defines
 134 the net outflow from the reservoir measured over $[0, T]$ in MW. When net outflow g is integrated
 135 over time (Eq. (5)) it equals amount of water left at the end of planning horizon, T, which should be
 136 above or equal to the predefined level, s_T . To preserve clarity, in depth analysis of the primal and
 137 dual problems is provided in the comments section. Therefore, a primal problem is (the variables
 138 denoted after the “;” in equations are the dual variables/shadow prices associated with the
 139 constraints):

Given

³ For more about CVaR in optimization problems see [13] and Theorems 14 and 16 in [18]

$$(\pi; n_{Tu}; k_{St}, n_{St}, k_{Tu}, s_0, s_T; d, e, k_{Rm}) \quad (1)$$

Maximize

$$\int_{t=0}^T \sum_{A \in \mathcal{F}_t} P(A) \cdot \pi(t, A) \cdot y(t, A) dt \quad (2)$$

Over

$$(\zeta, \eta, y) \quad (3)$$

Subject to

$$n_{Tu} + d^+(t) \leq y(t, A) \leq k_{Tu} + d^-(t) ; \kappa^{Tu}(t, A), v^{Tu}(t, A) \quad (4)$$

$$\int_{t=1}^T g(t, A) dt \leq s_T ; \lambda(A) \quad (5)$$

$$n_{St} \leq s_0 - \int_{\tau=1}^t g(\tau, A) d\tau \leq k_{St} ; v^{St}(t, A), \kappa^{St}(t, A) \quad (6)$$

$$\zeta(t) - I(t, A) - \eta(t, A) \leq 0 ; \varepsilon(t, A) \quad (7)$$

$$\eta(t, A) \geq 0 ; \delta(t, A) \quad (8)$$

$$F_\alpha(\eta(t, A), \zeta(t)) \geq k_{Rm} ; \xi(t) \quad (9)$$

Where

$$g(t, A) := y(t, A) - d(t, A) - e(t, A) \quad (10)$$

$$I(t, A) := \pi(t, A) \cdot y(t, A) \quad (11)$$

$$d(t) := d^-(t) + d^+(t) \quad (12)$$

$$|d^-(t)| \wedge d^+(t) = 0 \quad (13)$$

$$F_\alpha(\eta(t, A), \zeta(t)) := \zeta(t) - \frac{1}{1-\alpha} \sum_{A \in \mathcal{F}} P(A) \cdot \eta(t, A) \quad (14)$$

And its dual:

Given

$$(\pi; n_{Tu}, k_{St}, n_{St}, k_{Tu}, s_0, s_T; d, e, k_{Rm}) \quad (15)$$

Minimize

$$\begin{aligned} & \int_0^T \sum_{A \in \mathcal{F}_t} (k_{Tu} + d^-(t, A)) \cdot \kappa^{Tu}(t, A) - (n_{Tu} + d^+(t, A)) \cdot v^{Tu}(t, A) + (k_{St} - s_0) \cdot \kappa^{St}(t, A) \\ & + (s_0 - n_{St}) \cdot v^{St}(t, A) + (e(t) + d(t)) \cdot \psi(t, A) dt + \sum_{A \in \mathcal{F}_t} s_T \cdot \lambda(A) \\ & + \int_0^T k_{Rm}(t) \cdot \xi(t) dt \end{aligned} \quad (16)$$

Over

$$(\kappa^{Tu}, v^{Tu}, \kappa^{St}, v^{St}, \lambda, \varepsilon, \delta, \xi) \quad (17)$$

Subject to

$$\psi(t, A) + \kappa^{Tu}(t, A) - v^{Tu}(t, A) - \pi(t, A) \cdot \varepsilon(t, A) \geq \pi(t, A) \cdot P(A) \quad (18)$$

$$\frac{P(A)}{1 - \alpha} \cdot \xi(t) - \varepsilon(t, A) - \delta(t, A) \geq 0 \quad (19)$$

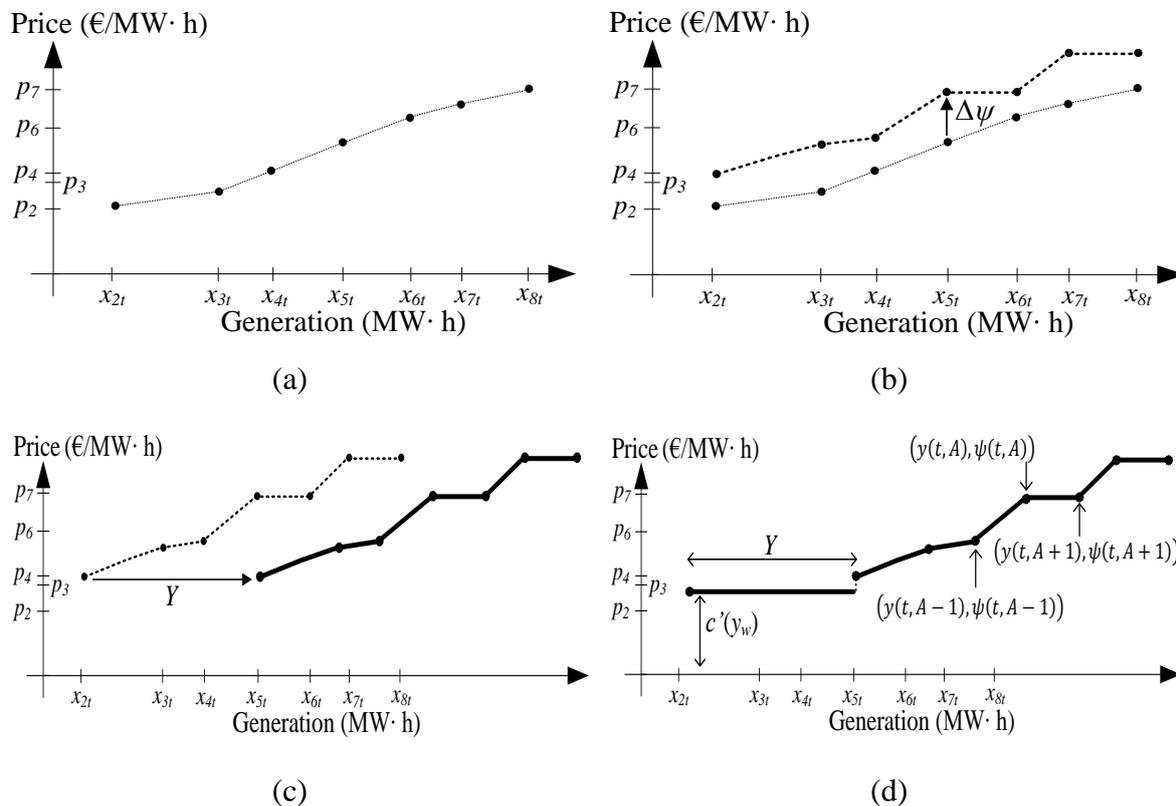
$$\sum_{A \in \mathcal{F}_t} (\varepsilon(t, A) - \delta(t, A)) \geq 0 \quad (20)$$

Where

$$\psi(t, A) := \lambda(A) + \int_{\tau=t}^T v^{St}(\tau, A) - \kappa^{St}(\tau, A) d\tau \quad (21)$$

140 For hour t and for each event A , the pairs (y, ψ) are obtained, where $\psi(t, A)$ is the water
 141 shadow price and $y(t, A)$ the hydro generation. Each event A represents "one dot" in the short-run
 142 marginal cost curve for the t^{th} hour as shown in Fig. 1(d). The Fig. 1(d) is the final short-run marginal
 143 cost curve of the hydro-wind coordination. The idea behind the primal and dual problem presented
 144 in Eqs. (1) - (21) is the process of construction which starts with the short-run marginal cost curve of
 145 the hydro generation [4] without the impact of wind power difference on the water shadow price [1]
 146 as seen on Fig. 1(a). To include the impact of wind power difference on the water shadow price, the
 147 wind power difference d , d^+ and d^- are implemented as discussed earlier. The resulting curve is
 148 one in the Fig. 1(b) where the impact of wind power difference on the water shadow price, $\Delta\psi$, is
 149 added to short-run marginal cost of hydro generation. The sign of $\Delta\psi$ depends on the sign of the
 150 wind power difference i.e. the surplus of wind d^+ means $\Delta\psi < 0$ which reduces the water shadow
 151 price while the shortage of wind d^- means $\Delta\psi > 0$ which increases the water shadow price in the
 152 coordinated generation [1]. After accounting for the wind differences, the whole short-run marginal
 153 cost curve should be horizontally shifted for forecasted wind generation, Y , as shown in the Fig. 1(c).
 154 This can be done since the effects of the wind generation on the generation range of hydro generation
 155 and the availability of water in the reservoir and resulting opportunity costs are already accounted

156 in the previous curve (Fig. 1(b)). Finally, the short-run marginal cost $c'(y_w)$ of wind generation y_w
 157 should be added in a merit order way (based on ascending order of price). In the Fig. 1(c) the $c'(y_w)$
 158 is lower than the water shadow price ψ and is ranked before hydro generation, otherwise it would
 159 be ranked last, or somewhere in the middle while shifting right part of the of the curve.



160 Fig. 1 The example of construction of the joint short-run marginal cost curves

161 For the low market price events A (and high opportunity cost) this approach would “force”
 162 marginal cost curve to adjust itself (horizontally and vertically) until the water shadow price ψ
 163 is less or equal than market price $\pi(t, A)$ for some hour t , i.e. $\psi(t, A) \leq \pi(t, A)$: $y(t, A) > 0$. Generally,
 164 there is no generation when water shadow price is greater than market price⁴.

165 The implementation of the presented approach is simple, especially when having in mind that
 166 the only needed equation for constructing marginal cost curves is the water shadow price ψ ,
 167 equation, Eq. (21). This equation can be used in the primal problems since the tools for modelling and
 168 optimization usually enable readout of the optimal values of the dual variables, i.e. readout of the
 169 shadow prices of each constraint. For calculating the water shadow price, the readout of tripe
 170 consisting of shadow prices $(\lambda, v^{St}, \kappa^{St})$ is needed.

171 3. Case study and Results

172 The primal and the dual problems are implemented with the GAMS Rev 239 modelling system
 173 under the CPLEX solver. The study is done for the 5th December in 2016 on the case of wind farm
 174 Vrataruša and hydropower system Vinodol, both located in Croatia. That specific week is considered
 175 as the worst-case scenario from the standpoint of water scarcity and wind power differences. It is
 176 assumed that wind farm Vrataruša and Vinodol hydropower system operate in hydro-wind
 177 coordination and that they completely avoid balancing cost. The modelled Vinodol hydropower
 178 system consists of: 3 reservoirs, 2 pumped-storage plants (PSP) and 1 hydropower plant (HP), with

⁴ See Theorem 4.9 in [2].

179 details given in Table 1 and Fig. 2. The energy stock at the beginning/end of a day and the natural
 180 water inflows are shown in Table 2. The difference between contracted and actual generated wind
 181 power is given in Fig. 4. These input parameters are obtained from the real life middle-term operation
 182 planning.

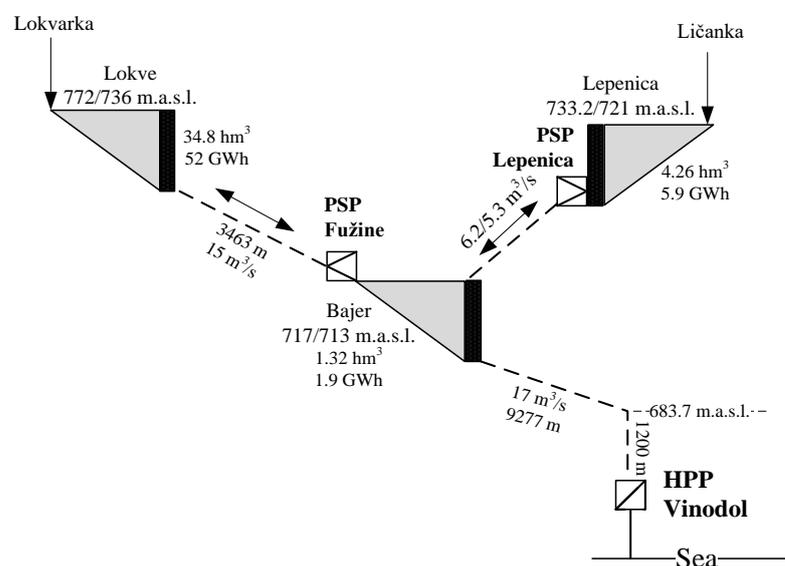
183 Table 1: HPS Vinodol facilities parameters.

Reservoir	k_{St} (GWh)	Power Plant	k_{Tu} / n_{Tu} (m ³ /s)	k_{Tu} / n_{Tu} (MW)
Lokve	52	PSP Fužine	10/9	4.6/4.8
Bajer	1.9	HPP Vinodol	18.6	94.5
Lepenica	5.9	PSP Lepenica	6.2/5.3	1.14/1.25

184 Table 2: Energy stock in percent of maximum reservoir capacity k_{St} at the beginning of and the end
 185 of planning interval

Reservoir	s_0	s_T	e (m ³ /s)
Lokve	66	46	0,68
Bajer	64	64	0,89
Lepenica	58	58	0,21

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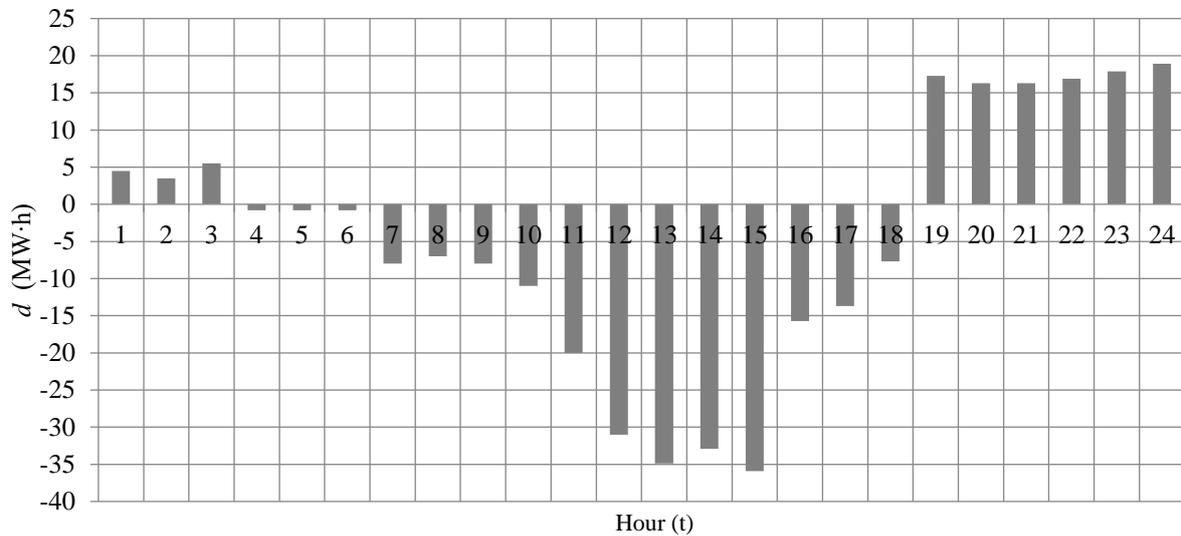
187

188 Fig. 2 Model of the Vinodol hydropower system

189 The wind farm Vrataruša consists of 14 units, each with 3 MW of installed power. The total
 190 installed power is 42 MW with minimum power output 1.1 MW. For the computational effectiveness,
 191 only the hydro power plant Vinodol profit is maximized. There is no significant loss in accuracy since
 192 the revenue of hydro power plant Vinodol participates with 95% in total system's revenue. The ramp
 193 rate limits of the hydro power plant Vinodol are: MSR (up) 255.15 (MW/min); MSR (down) 340.2
 194 (MW/min). Therefore, there are no constraints on ramping capabilities in the model. The real
 195 hydropower system Vinodol has conversion coefficient ρ equal to 5.08 (MW/m³) and is used for
 196 frequency regulation ancillary services [32]. A total of 10 electricity price events is generated with the

197 random number generator based on the statistical analyses of the Croatian nodal electricity prices of
 198 the first week of December 2016 with the same probability of each event equal to $P(A) = \frac{1}{10}, \forall t \in$
 199 $T \forall A \in \mathcal{F}_t$. The CVaR percentile α is 85%.

200



201

202

Fig. 4 The wind power difference (d) for 5th December of 2016.

203

3.1 Results

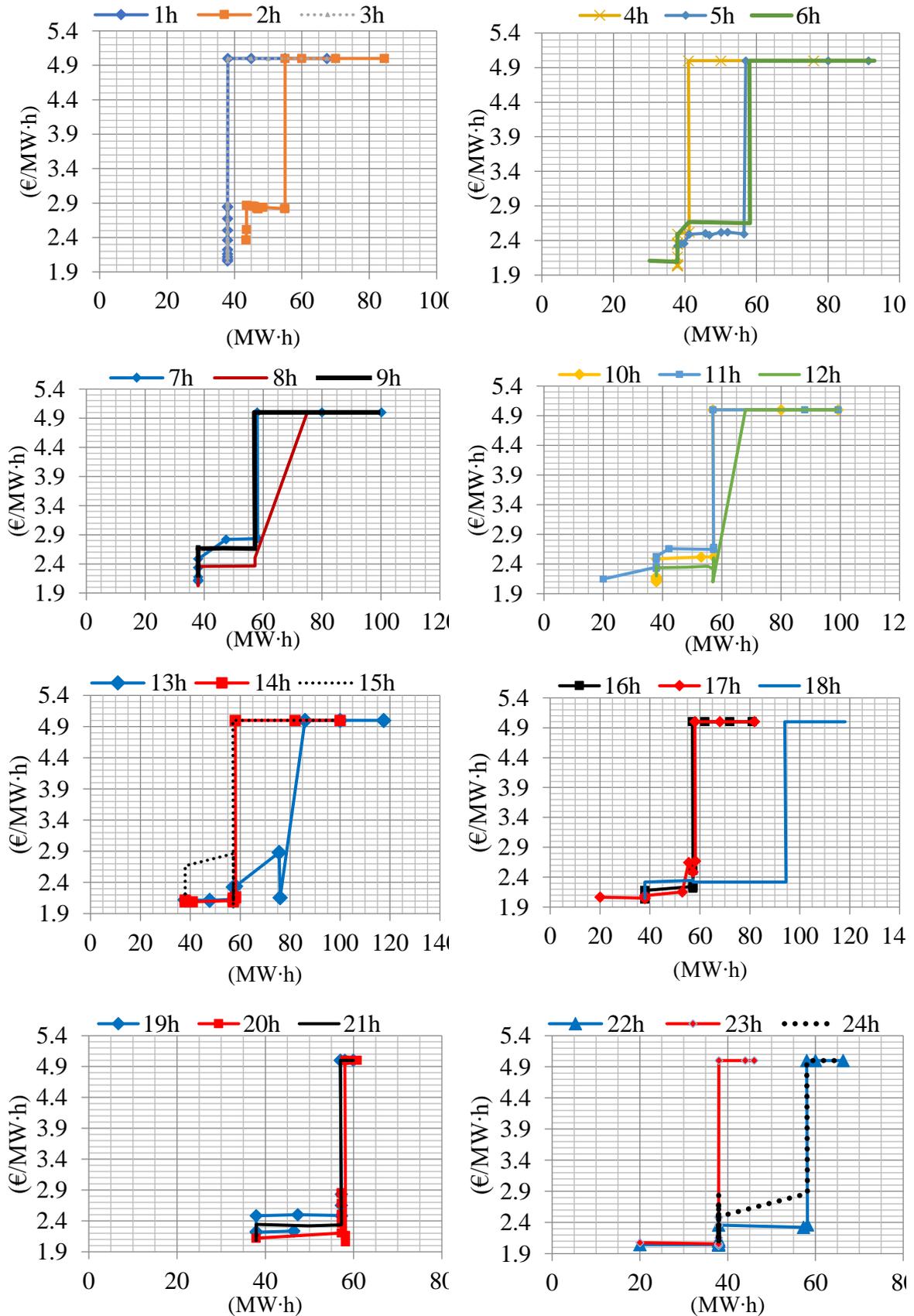
204 The results are shown in Table 3 and Fig. 5. The Table 3 shows the dependence of expected daily
 205 revenue on the risk mitigation parameter k_{Rm} used for hourly risk exposure reduction (it defines the
 206 minimum expected return in the $1-\alpha$ worst outcomes for each hour). The curves (Fig. 5) are for the
 207 hourly risk exposure of 1380 € and 5 €/ MW·h of short-run marginal costs of Vrataruša wind farm
 208 generation.

209

Table 3 The expected daily revenue and associated risk exposure reduction $k_{Rm}, \forall t$

Revenue (€)	k_{Rm} (€)
98885	0
97995	400
97100	800
96332	1380

210



211
212

Fig. 5 The short-run marginal costs curves for electricity generation of a Vinodol and Vrataruša hydro-wind coordination.

213 *3.2 Discussion*

214 **Risk mitigation and daily revenue.** As parameter used for hourly risk exposure reduction k_{Rm}
215 increases from 0 € to 1380 €, the expected daily revenue decreased from 98 885 € to 96 332 € (Table 3).

216 **Risk mitigation and the vertical shift of marginal cost curves.** As parameter for hourly risk
217 exposure reduction k_{Rm} increases from 0 € to 1380 €, the short-run marginal cost curves (Fig. 5) are
218 vertically shifted upwards from 1.9 €/MW·h to approximately 2.5 €/MW·h. This means that the hourly
219 risk exposure reduction has a certain cost that can be calculated from the marginal cost curves in Fig.
220 5. In average this cost is $2.5 \text{ €/MW}\cdot\text{h} - 1.9 \text{ €/MW}\cdot\text{h} = 0.6 \text{ €/MW}\cdot\text{h}$. Therefore 0.6 €/MW·h is the price of
221 electricity which ensures owner with at least 1380 € in the worst-case scenario. Of course, this
222 insurance is at the expense of the daily revenue, which decreases.

223 **Range of generation in marginal cost curves.** The range of generation of Vrataruša-Vinodol
224 coordination is usually from 38 MW·h to 58 MW·h (Fig. 5). The one general conclusion can be drawn
225 regarding range of generation in joint marginal cost curves, that for low electricity prices (1h-3h and
226 22h- 24h) there is no desire to produce less than 38 MW·h. It is obvious that in hours with higher
227 prices (13h-18h) coordination want to produce even more than 58 MW·h and up to 80-90 MW·h.

228 **Prices in marginal cost curves.** The short-run marginal cost curves are characterised by relatively
229 low (compared to market prices) cost which is a result of a low water shadow price. Perfectly inelastic
230 parts of the short-run marginal cost curves are obtained for the values 38 MW·h and 58 MW·h (Fig.
231 5).

232 **4. Conclusion**

233 The approach presented in this paper analyses the case of short-run hydro-wind coordination
234 which participates on the electricity market. This research contributes with the approach based on
235 duality method of convex programming for determining the joint short-run marginal cost curves for
236 an electricity generation of the hydro-wind coordination, which as a novelty combines risk mitigation
237 and the water shadow price. The proposed approach is easy to implement in various optimization
238 problems. Proposed method is suitable for investors with various risk preferences, from risk-averse
239 to risk-neutral or risk-seeking, since it enables risk mitigation. It has been shown that the perfectly
240 inelastic short-run marginal cost curves are appropriate for Vrataruša-Vinodol hydro wind
241 coordination which follows from the fact that the water shadow price was constant over the various
242 price events in particular hour. Therefore, it is justified to use simplified method for calculating water
243 shadow price which is constant over the planning period. It has been shown that the risk mitigation
244 has a cost and that this cost is easily quantified which is exemplified and discussed in the paper.

245 **Acknowledgments:** This research paper is made possible through the support from Department of Energy and
246 Power Systems of University of Zagreb Faculty of Electrical Engineering and Computing.

247 **Author Contributions:** Perica Ilak and Ivan Rajšl have contributed in developing the ideas and formulation of
248 the optimization problem. Josip Đaković and Marko Delimar have been involved in implementation of the
249 problem and analysis of the results. All the authors are involved in preparing the manuscript.

250 **Conflicts of Interest:** The authors declare no conflict of interest.

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