# REVUB: User Manual

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The REVUB model ("Renewable Electricity Variability, Upscaling and Balancing") was developed 1 specifically to address the challenge of optimising hydro-solar-wind complementarity through smart 2 hydropower operation and smart choice of solar-wind portfolios. We first explain the general principles 3 of the REVUB model (Note 1), based on which the different modules of the model are explained one by one: hydropower plant classification (Note 2); simulation of hydropower generation and reservoir dynamics (Note 3); and simulation and optimisation of joint hydro-solar-wind operation (Note 3 -Note 5). An optional, additional assessment of pumped-storage potential with REVUB is described in Note 6. Some notes on spinning reserve requirements are summarised in Note 7. An overview table of terms and symbols used in the model description is given in Note 8. The REVUB code exists for Python and MATLAB environments and can be accessed via https://github.com/VUB-HYDR/REVUB 10 and used under the MIT license. All equations given in this document are referenced in the code wherever relevant/used. The ways to prepare input, run the code, and interpret output are given 12 in Note 9, Note 10 and Note 11. Examples of REVUB use in literature are enumerated in Note 12. 13

#### 4 Note 1 Principles of REVUB

The basic idea of REVUB is to assess the potential of reservoir hydropower to assist in the grid inte-15 gration of variable power generation, e.g. from solar PV and wind power. Since reservoir hydropower 16 can be flexibly dispatched, the premise is that every hydropower plant can help compensate for part 17 of the variability of the pooled solar/wind resources on the same grid <sup>1,2</sup>. This requires adaptations, 18 down to hourly resolution, of the conventional reservoir rule curves applied to keep reservoir water 19 levels within acceptable ranges on seasonal and multiannual time scales. 20 REVUB calculates the adapted rule curves required for balancing a given solar/wind mix, and opti-21 mises the amount of solar/wind power whose variability each hydropower plant can compensate, based 22 on three criteria: (i) reservoir lake levels must remain stable under the new rule curves, comparably 23 to conventional reservoir operation, on seasonal and multiannual time scales; (ii) the resulting hydro-24 solar-wind power mix must be reliable, i.e. capable of consistently meeting a certain load from hour 25 to hour, month to month and year to year without failure (unless, in rare cases, extreme droughts 26 force hydropower curtailment); and (iii) downstream environmental flow constraints are never to be 27 violated. An overview of the calculation steps performed by REVUB is given in Fig. S1. The steps 28 outlined in this chart are described in more detail in the next sections, as indicated.

#### Note 2 Hydropower plant categorisation

In REVUB, hydropower plants are categorised into two groups, based on whether the average natural 31 inflow would take more or less than one year to fill the reservoir; in other words, whether the reservoir 32 is "large" or "small" compared to the inflow. For plants in the "large" category, rule curves can be 33 designed to ensure outflow and power output are relatively stable from month to month <sup>3,4</sup>, enabling 34 the plant to serve as baseload provider. Such rule curves typically boil down to parameterisations of 35 required outflow as a function of lake level<sup>5</sup>. For hydropower plants in the "small" category, rule curves 36 should additionally take into account that during the wet season(s), certain fractions of the received 37 water need to be directly released from the reservoir without being stored, as reservoir capacity would 38 be insufficient for this<sup>6</sup>. Small hydropower plants thus operate partly as run-of-river plants. 39 In mathematical terms, the classification of hydropower plants as "large" or "small" is done by calcu-40 lating the dimensionless filling time  $\tau_{fill}$ :

 $\tau_{fill} = \frac{V_{max}/T_{year}}{Q_{in.nat}(t)},\tag{S1}$ 

where  $V_{max}$  is the reservoir volume (in m<sup>3</sup>),  $T_{year}$  is the number of seconds in a year, and  $Q_{in,nat}(t)$  denotes natural reservoir inflow (in m<sup>3</sup>/s). By default, hydropower plants are classified by REVUB as large or small based on whether their  $\tau_{fill}$  is larger or smaller than unity, respectively; but this can be changed by the user.





[model] Iterate to find optimal target load to be met by hydro-solar-wind operation: Step 1 (i) Multi-year lake level stability comparable to regular operation (Note 3.2); (ii) Reliability of hydro-solar-wind mix in consistent load-following (Notes 3.2, 4); (iii) Environmental flow requirements met at all times (Notes 3.2, 4); **Optimisation** [model] Calculate hydro-solar-wind ELCC supportable by hydropower (Note 3.2); & output Step 3 [user] Define output graphs to be produced.

Figure S1: Flowchart of the REVUB model approach, explaining the steps taken in modelling hydro, solar and wind power and their integration. ELCC = Effective Load Carrying Capability. See also Note 9, Note 10 and Note 11 he for the ways to prepare input, run the code, and interpret output.

Regardless of whether a plant is classified as large or small, it could be operated according to alternative rule curves with similar seasonal to multiannual outcomes as those resulting from conventional 47 operation, but with additional patterns in water release from sub-daily to seasonal timescales, designed 48 for balancing supply with demand in a power mix with a high share of variable renewable electric-49 ity (RE). This would mean allocating a portion of the inflowing water for flexible use and releasing 50 it to generate extra power whenever needed to meet a certain load, such as during evening and night 51 hours when solar PV output is low or zero. Even for large hydropower plants, only part of the water intake can be allocated for flexible use, as a minimum stable outflow usually has to be guaranteed for at least two reasons: (i) safeguarding power 54 system stability, since requirements for inertia impose having some synchronous capacity, such as from 55 hydroturbine-driven generators, dispatched at all times<sup>7</sup>; and (ii) safeguarding downstream ecological 56 integrity<sup>8</sup>. Thus, reservoir outflow must have a stable and a flexible component, which are denoted 57 respectively  $Q_{stable}(t)$  and  $Q_{flexible}(t)$  (both in m<sup>3</sup>/s). Overall flexibility can be increased by reducing 58  $Q_{stable}(t)$  in favour of  $Q_{flexible}(t)$ . Essentially, to allocate a certain amount of water for flexible use, 59 the stable outflow will have to be reduced by a comparable amount such that the overall water budget 60 remains unchanged. 61 Total reservoir outflow may have two other components: a seasonal ("run-of-river") component, de-62 noted  $Q_{RoR}(t)$ , for small hydropower plants; and an overflow-prevention component  $Q_{spill}(t)$ , rep-

$$Q_{out}(t) = Q_{stable}(t) + Q_{flexible}(t) + Q_{RoR}(t) + Q_{spill}(t), \tag{S2}$$

for both large and small hydropower plants. Correspondingly, hydropower generation consists of components  $P_{stable}^{hydro}(t)$ ,  $P_{flexible}^{hydro}(t)$  and  $P_{RoR}^{hydro}(t)$  (in MW) <sup>i</sup>.

extremely wet periods. Thus, total reservoir outflow  $Q_{out}(t)$  is, in general, given by

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resenting the release of water via spillways when filling levels approach critical values, e.g. during

<sup>&</sup>lt;sup>i</sup>It is assumed that overflow prevention releases are never used for power generation, to avoid damaging turbine equipment and because such high flows would normally exceed turbine capacity anyway.

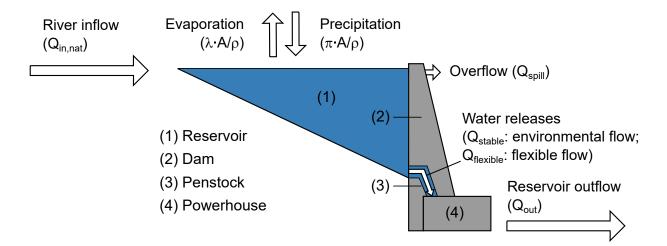


Figure S2: Flowchart of the water gains and losses of a large hydropower plant as modelled in REVUB. Gains consist of river discharge and lake surface precipitation; losses consist of reservoir outflows and lake surface evaporation.

In the next sections, the simulations in REVUB of flexibility provision by large and small hydropower plants are discussed in detail. Note 3 and Note 4 deal with large plants; Note 5 with small plants.

#### Note 3 Reservoir simulation for large hydropower plants

The volume of water V(t) contained in a large hydropower plant's reservoir is given by the recursive relation

$$V(t + \Delta t) = V(t) + \left[ Q_{in,nat}(t) - Q_{stable}(t) - Q_{flexible}(t) - Q_{spill}(t) + \left[ \pi(t) - \lambda(t) \right] \frac{A(t)}{\rho} \right] \Delta t, \quad (S3)$$

where  $\pi(t)$  and  $\lambda(t)$  are respectively precipitation and evaporation flux (kg/m<sup>2</sup>/s; see Methods); A(t)is the surface area of the reservoir lake (m<sup>2</sup>);  $\rho$  the density of water (taken to be 1000 kg/m<sup>3</sup>); and  $\Delta t$ 74 is the simulation time step (one hour is the default in REVUB). Seepage losses, which are usually very 75 small in reservoirs<sup>6,9</sup>, are neglected in the REVUB code (but could be included e.g. via a correction 76 factor to total inflow). A schematic diagram of the involved water fluxes is given in Fig. S2. 77 Note 3.1 explains how  $Q_{stable}(t)$  and the corresponding power generation  $P_{stable}^{hydro}(t)$  are modelled for 78 conventional, baseload-oriented operation, in which the flexible components are zero. Simulating con-79 ventional operation is necessary to have a reference time series of long-term lake volume fluctuations, based on which the balancing-oriented operation can be calibrated. Subsequently, Note 3.2 explains 81 how  $Q_{stable}(t)$  and  $Q_{flexible}(t)$ , and the corresponding power generation components  $P_{stable}^{hydro}(t)$  and 82  $P_{flexible}^{hydro}(t)$ , are modelled for balancing-oriented operation.

# Note 3.1 Conventional (baseload-oriented) operation

We denote conventional, baseload-oriented operational rules with the abbreviation "CONV". By definition,  $Q_{flexible,CONV}(t)$  and  $P_{flexible,CONV}^{hydro}(t)$  are zero. The default way of modelling  $Q_{stable,CONV}(t)$ in REVUB is based on logarithmic-exponential release rules <sup>4,10</sup>, which works well in case conventional operational rules are unknown, and can be determined on the basis of long-term average inflow:

$$Q_{stable,CONV}(t) = \left\{ \begin{array}{l} \overline{Q_{in,nat}(t)} \left[ d_{min} + \ln\left(\kappa \left[ \frac{V_{CONV}(t)}{V_{max}} \right]^{\phi} + 1 \right) \right], & \text{for } V_{CONV}(t)/V_{max} < f_{opt} \\ \overline{Q_{in,nat}(t)} \left[ \exp\left(\gamma \left[ \frac{V_{CONV}(t)}{V_{max}} - f_{opt} \right]^{2} \right) \right], & \text{for } V_{CONV}(t)/V_{max} \ge f_{opt} \end{array} \right\}, \quad (S4)$$

where  $d_{min}$  is the fraction of yearly average inflow required as minimum stable outflow;  $V_{max}$  is the maximum reservoir storage capacity;  $f_{opt}$  is the optimal filling fraction; and  $\kappa$ ,  $\phi$  and  $\gamma$  are constants.

 $\kappa$  and  $\phi$  are given<sup>4</sup> by

$$\kappa = f_{opt}^{-\phi} \left[ \exp\left(1 - d_{min}\right) - 1 \right],$$
(S5)

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$$\phi = \alpha \tau_{fill}^{1/2}. (S6)$$

Default values are  $f_{opt} = 80\%$ ,  $\alpha = 2/3$ , and  $\gamma = 10$  based on generalised reservoir operation rules <sup>4,10</sup>; and  $d_{min} = 40\%$  based on generalised environmental flow rules<sup>8</sup>.

The overflow prevention component  $Q_{spill,CONV}$  is modelled as 95

$$Q_{spill,CONV}(t) = \left\{ \begin{array}{ll} 0, & \text{for } V_{CONV}(t)/V_{max} < f_{spill} \\ \max \left[ 0, \left( Q_{in,nat}(t) + \left[ \pi(t) - \lambda(t) \right] \frac{A_{CONV}(t)}{\rho} \right) (1+\mu) - Q_{stable,CONV}(t) \right], & \text{for } V_{CONV}(t)/V_{max} \ge f_{spill} \\ (S7) \end{array} \right\},$$

where  $f_{spill}$  is the filling fraction at which the overflow prevention starts<sup>ii</sup>, and  $\mu$  represents a small fraction such that lake levels are brought below critical levels  $f_{spill}V_{max}$  as quickly as possible without 97 releasing unnaturally high flows downstream; default values are  $f_{spill} = 95\%$  and  $\mu = 0.1$ , but these 98 can be changed by the user. 99 To simulate minimum drawdown levels when facing drought-like situations, one further rule is added

100 to equation (S4): outflow, and with it hydropower production, is automatically curtailed 5,11 if the 101 volume levels  $V_{CONV}(t)$  dip below critical levels  $f_{stop}V_{max}$ , and only restarted once volumes have 102 recovered to  $f_{restart}V_{max}$ . The values  $f_{stop} = 10\%^{11}$  and  $f_{restart} = 20\%$  are defaults in REVUB, but 103 can be changed by the user. 104

The corresponding stable power output  $P_{stable,CONV}^{hydro}(t)$  can then be calculated as 105

$$P_{stable,CONV}^{hydro}(t) = \min \left[ Q_{stable,CONV}(t); Q_{turb}^{max} \right] \eta_{turb} \rho g h_{CONV}(t), \tag{S8}$$

where  $\eta_{turb}$  is the turbine efficiency (%), g the gravitational acceleration (9.81 m/s<sup>2</sup>), and h(t) the 106 hydraulic head (m), i.e. the difference in water level between the headwater behind the dam and the 107 tailwater at the turbines. The efficiency of  $\eta_{turb}$  should be user-defined<sup>iii</sup>. The calculation of h(t) is 108 explained in Note 3.3.  $Q_{turb}^{max}$  is the maximum turbine throughput (at which the power generating 109 capacity of the turbine is fully used), which is approximated with  $Q_{turb}^{max} \approx P_{turb}^{r}/(\eta_{turb}\rho gh_{max})$ , where 110  $P_{turb}^{r}$  is the rated power capacity of the hydropower plant and  $h_{max}$  is the maximum hydraulic head. 111 With these rules, results are mostly independent of arbitrary initial conditions (convergence to the same 112 time series happens typically within 2 simulation months). The initial condition  $V_{CONV}(0) = f_{opt}V_{max}$ 113 (and the corresponding lake area and water level; see Note 3.3) are defaults in REVUB, but can be changed by the user. 115 We note that, in case the user wishes to include their own conventional reservoir rules, this is possible 116 by correspondingly adapting the default REVUB code by adapting the lines referring to the above 117 equations. 118

#### Balancing-oriented operation 119

Reservoir operation oriented towards balancing solar and wind power variability is denoted with the 120 abbreviation "BAL". For reservoirs of large hydropower plants, BAL operation is modelled as follows. 121 First, the needs for sub-daily to seasonal dispatching patterns must be established. The load difference 122  $P_d(t)$  between total inflexible power generation (stable hydropower, solar power, and wind power) and power demand is calculated as:

$$P_d(t) = P_{stable,BAL}^{hydro}(t) + c_{solar} \cdot CF_{solar}(t) + c_{wind} \cdot CF_{wind}(t) - L(t)$$

$$= P_{inflexible}(t) - L(t). \tag{S9}$$

ii Note that every hydropower plant has a certain safety level, i.e. the dam is always somewhat higher than the maximum water level<sup>5</sup>, to mitigate flood risk. Because of this safety level, should the overflow procedure fail for any reason, the dam would not immediately overflow. However, flooding would occur along the shores of the lake, which is why it is always prudent to prevent straining the safety level.

iiiThe efficiency of hydroturbines depends somewhat on the effective turbined flow at each moment, but is typically above 80% in realistic ranges of the latter  $^{12,13}$ .

Here,  $c_{solar}$  and  $c_{wind}$  represent a certain amount of solar PV and wind power capacity, respectively (in MW), whose value is to be optimised by REVUB;  $CF_{solar}(t)$  and  $CF_{wind}(t)$  represent the solar and wind capacity factor for each time step, respectively; and L(t) represents a certain target load profile that is to be followed<sup>iv</sup>.

The time series L(t), by default, is set as follows:

$$L(t) = P_{load}L_{norm}(t), (S10)$$

with  $P_{load}$  a constant determining the average load to be followed and reflecting the constraints on overproduction, and  $L_{norm}(t)$  the normalized  $(\overline{L_{norm}(t)}=1)$  hour-to-hour load profile.  $P_{load}$  is calculated as

$$P_{load} = p_i(P_{inflexible}(t)), \tag{S11}$$

where  $p_i(x)$  denotes the  $i^{th}$  percentile of a variable x. Here, i thus represents the percentile of  $P_{inflexible}$  not exceeding  $P_{load}$ ; in other words, the percentage of time during which RE generation should not 133 134 exceed the average load to be followed. Generally, the lower i, the higher the amount of allowed excess 135 production (overproduction) as compared to L(t). 136 In REVUB, the time series  $CF_{solar}(t)$  and  $CF_{wind}(t)$  must be provided as model input by the user. 137 These could represent power generation from single locations, or weighted averages across the locations 138 for on-grid solar or wind power selected for the region under scrutiny, to simulate the feed-in of solar 139 and wind power from various locations into the same power grid. In case of the latter, we recommend assuming that the total capacity is distributed across locations within the region according to site-141 specific weight factors  $w_{solar}^n$  and  $w_{wind}^n$ . Then,  $CF_{solar}(t)$  and  $CF_{wind}(t)$  would be given by

$$CF_{solar}(t) = \frac{\sum_{n=1}^{N_{solar}} CF_{solar}^{n}(t)w_{solar}^{n}}{\sum_{n=1}^{N_{solar}} w_{solar}^{n}}; CF_{wind}(t) = \frac{\sum_{n=1}^{N_{wind}} CF_{wind}^{n}(t)w_{wind}^{n}}{\sum_{n=1}^{N_{wind}} w_{wind}^{n}},$$
(S12)

with  $CF^n_{solar}(t)$  and  $CF^n_{wind}(t)$  the capacity factors of solar PV or wind power for each time step, respectively, at each individual site with index n; and  $N_{solar}$  and  $N_{wind}$  the number of sites for solar PV or wind power generation, respectively. The weight factors  $w^n_{solar}$  and  $w^n_{wind}$  represent preferences for certain sites over others for the development of solar PV and wind parks. Given that sites with a higher yield would typically tend to be preferred, a simple approach would be to take a site's weight factor to be equal to the multi-year average capacity factor for solar PV or wind power at that site:

$$w_{solar}^{n} = \overline{CF_{solar}^{n}(t)}; \ w_{wind}^{n} = \overline{CF_{wind}^{n}(t)}.$$
 (S13)

The capacity ratio  $c_{solar}:c_{wind}$  should also be user-defined; it represents the relative share of solar and wind capacity to be deployed by the model. Sensitivity tests to find an optimal ratio can then be performed by running the model for several values of the capacity ratio. Second, in BAL operation,  $Q_{stable}(t)$  is reduced in favour of  $Q_{flexible}(t)$  such that L(t) can be met by the combination of stable hydropower, flexible hydropower, solar power and wind power. Thus,  $Q_{stable,BAL}(t)$  should be a fraction of the average inflow:

$$Q_{stable,BAL}(t) = (1 - C_{OR})\overline{Q_{in,nat}(t)}.$$
(S14)

The fraction  $C_{OR}$  denotes the "operating reserve coefficient" <sup>14</sup>, and determines the amount of water available for flexible use. Theoretically, as  $C_{OR} \to 1$ , the hydropower plant in question would operate near-completely flexibly and provide almost no minimum stable load. This would also imply that the outflow of the dam could become zero for prolonged periods; for instance, when solar/wind power generation is high and/or demand is low. Such operation would violate (i) inertia requirements and minimum load constraints of the plant, and (ii) environmental flow requirements. As default, REVUB therefore uses an upper bound of  $C_{OR}^{max} = 1 - d_{min} = 60\%$ , such that the minimum outflow

ivNote that for the terms in equation (S9), MW and MWh are interchangeable units, due to the hourly time step employed in REVUB. Similarly, *CF* could be interpreted both as actual power generation divided by maximum potential generation in each hour (dimensionless fraction), or as power generation per unit of capacity (in hours).

under BAL is always consistent with that under CONV. The selection of the optimal  $C_{OR}$  for each hydropower plant is explained in Note 4.

 $P_{stable,BAL}^{hydro}(t)$  is calculated analogously to  $P_{stable,CONV}^{hydro}(t)$  in equation (S8):

$$P_{stable,BAL}^{hydro}(t) = \min \left[ Q_{stable,BAL}(t); Q_{turb}^{max} \right] \eta_{turb} \rho g h_{BAL}(t). \tag{S15}$$

Third, the necessary amount of flexible outflow  $Q_{flexible,BAL}(t)$  and corresponding flexibly produced power  $P_{flexible,BAL}^{hydro}(t)$  are determined for the instances when  $P_{inflexible}(t)$  cannot meet L(t), i.e. when  $P_{flexible,BAL}(t) = P_{flexible,BAL}(t)$  to maximize the followed load under peak capacity constraints and ramping constraints  $P_{flexible,BAL}(t)$  to maximize the followed load under peak capacity constraints and ramping constraints  $P_{flexible,BAL}(t)$ 

$$P_{flexible,BAL}^{hydro}(t) = \left\{ \begin{array}{l} 0, & \text{for } P_d(t) \geq 0 \\ \min \left[ Q_{turb,flexible}^{pot}(t) \eta_{turb} \rho g h_{BAL}(t); \min \left[ |P_d(t)|; P_{flexible,BAL}^{hydro}(t-1) + \Delta P_{turb}^{ramp} \right] \right], & \text{for } P_d(t) < 0 \ \& \ \Delta P_d(t) < 0 \\ \min \left[ Q_{turb,flexible}^{pot}(t) \eta_{turb} \rho g h_{BAL}(t); \max \left[ |P_d(t)|; P_{flexible,BAL}^{hydro}(t-1) - \Delta P_{turb}^{ramp} \right] \right], & \text{for } P_d(t) < 0 \ \& \ \Delta P_d(t) \geq 0 \end{array} \right\},$$
(S16)

where  $\Delta P_d(t) = P_d(t) - P_d(t-1)$  determines whether the hydropower plant should ramp up  $(\Delta P_d(t) < 170)$  or down  $(\Delta P_d(t) \ge 0)$ ;  $\Delta P_{turb}^{ramp}$  is the maximum ramp rate of the plant (in MW per time step);

171 and

$$Q_{turb,flexible}^{pot}(t) = \max \left[ 0; Q_{turb}^{max} - Q_{stable,BAL}(t) \right]. \tag{S17}$$

This gives a flexible outflow

$$Q_{flexible,BAL}(t) = \frac{P_{flexible,BAL}^{hydro}(t)}{\eta_{turb}\rho g h_{BAL}(t)}.$$
 (S18)

Fourth, the overflow prevention component  $Q_{spill,BAL}(t)$  is calculated analogously to equation (S7):

$$Q_{spill,BAL}(t) = \left\{ \begin{array}{ll} 0, & \text{for } V_{BAL}(t)/V_{max} < f_{spill} \\ \max \left[ 0, \left( Q_{in,nat}(t) + \left[ \pi(t) - \lambda(t) \right] \frac{A_{BAL}(t)}{\rho} \right) (1+\mu) - Q_{stable,BAL}(t) - Q_{flexible,BAL}(t) \right], & \text{for } V_{BAL}(t)/V_{max} \ge f_{spill} \end{array} \right\} \cdot \\ \text{(S19)}$$

As in CONV, to ensure that lake levels do not dip precariously low,  $Q_{stable,BAL}$  and  $Q_{flexible,BAL}$  are

reduced to zero when  $V_{BAL}(t) < f_{stop}V_{max}$  and restarted once  $V_{BAL}(t) \ge f_{restart}V_{max}$ .

Since one needs the hydraulic head  $h_{BAL}(t)$  to calculate  $P_{stable,BAL}^{hydro}(t)$  from equation (S15), but  $h_{BAL}(t)$ 

follows only from the overall operation, which requires knowledge of  $P_{stable,BAL}^{hydro}(t)$  to calculate  $P_d(t)$  according to equation (S9), this problem is solved iteratively by REVUB with an initial guess of

 $P_{stable,BAL}^{hydro}(t) = (1 - C_{OR})P_{stable,CONV}^{hydro}(t)$ , repeated until convergence (typically, 3-6 iterations suffice).

The calculation of h(t) is the same as for CONV and is explained in Note 3.3.

At given  $C_{OR}$  and given ratio  $c_{solar}:c_{wind}$ , REVUB optimises the above operation by identifying the time series  $L(t)=L_{opt}(t)$ , and the corresponding optimal  $c_{solar}=c_{solar}^{opt}$  and  $c_{wind}=c_{wind}^{opt}$ , for which the resulting lake level time series is most comparable to what it would be under CONV operation. This optimisation is performed by finding the minimum of the relative deviation  $\Psi$  between the CONV and BAL lake levels across all time steps of an entire simulation period, as a function of  $c_{solar}$  and  $c_{wind}$ :

$$\Psi(c_{solar}, c_{wind}) = \frac{\overline{|(V_{BAL}(t) - V_{CONV}(t))|}}{\overline{V_{CONV}(t)}};$$
(S20)

186 where

$$\min\left(\Psi\right) = \Psi(c_{solar}^{opt}, c_{wind}^{opt}). \tag{S21}$$

Note that the code could also be adapted to optimise lake levels compared to a certain mathematical rule curve, instead of to the outcome of "conventional" operational rules (Note 3.1). This would simply require exchanging  $V_{CONV}(t)$  in equation (S20) by the corresponding rule curve of lake volume. Note furthermore that even when doing this, it is still useful to calculate the outcomes (hydropower generation and lake levels) resulting from conventional reservoir management, to verify (i) how well the rule curve can be followed in general under the given hydroclimate and occurrence of wet/dry years, and (ii) the extent to which the outcomes of flexible operation would differ from baseload-oriented operation.

REVUB assures that power droughts resulting from V(t) dipping lower than  $f_{stop}V_{max}$  can never be more severe under BAL operation than under CONV, by automatically discarding any solutions to equation (S21) where this would be the case.

Once the optimal solution is found, the Effective Load Carrying Capability (ELCC) of the hydro-solar-wind mix is calculated as follows. The maximum followable load  $L_{followed}(t) = P_{followed}L_{norm}(t)$ , which the hydro-solar-wind mix can meet without any load loss, is identified: this is the load at which the residual load  $(L_{res}(t);$  the load minus the generation) has a maximum of zero. Thus,  $P_{followed}$  is the value for which max  $[L_{res}(t)] = 0$ , with  $L_{res}(t)$  defined as:

$$L_{res}(t) = P_{followed}L_{norm}(t) - \left[P_{stable,BAL}^{hydro}(t) + P_{flexible,BAL}^{hydro}(t) + c_{solar}^{opt} \cdot CF_{solar}(t) + c_{wind}^{opt} \cdot CF_{wind}(t)\right]. \tag{S22}$$

The ELCC is then defined as the integral of  $L_{followed}(t)$  over all time steps in a simulation year:

$$ELCC = \int_{year} L_{followed}(t)dt.$$
 (S23)

The ELCC thus represents the total yearly load followed by each hydropower plant in combination with 204 the solar and wind power whose variability it can compensate, under the optimal solution. The aggre-205 gate of ELCC across all hydropower plants represents the total followable load when all hydropower 206 plants optimally contribute to compensating solar-wind variability; it is abbreviated ELCC<sub>tot</sub> here-207 208 Ideally,  $L_{followed}(t)$  should be equal to  $L_{opt}(t)$  (and it usually is), but due to peaking constraints of 209 hydropower plants (eq. (S17)), this is not guaranteed in every case. When  $L_{followed}(t) < L_{opt}(t)$ , the 210 power plant's peaking capabilities are insufficient to meet all required peaks in  $L_{opt}(t)$  together with 211 solar and wind power. In such cases, the hydropower plant should run at somewhat lower flexibility, 212 i.e. lower  $C_{OR}$ , at which a lower  $L_{opt}(t)$  will apply that would put less strain on the plant's peaking 213 capabilities, ensuring that  $L_{followed}(t) \approx L_{opt}(t)$ . This resimulation is done automatically by the 214 REVUB code (Note 4). 215 The total contributions of hydro, solar and wind power to yearly electricity generation, denoted respectively  $E_{reservoir}^{hydro}$ ,  $E_{solar}$  and  $E_{wind}$ , are obtained by integrating their respective power output 217 across all time steps in a simulation year. First,  $E_{reservoir}^{hydro}$  is equal to 218

$$E_{reservoir}^{hydro} = E_{stable}^{hydro} + E_{flexible}^{hydro} = \int_{year} \left( P_{stable}^{hydro}(t) + P_{flexible}^{hydro}(t) \right) dt. \tag{S24}$$

Second,  $E_{solar}$  and  $E_{wind}$  are obtained by multiplying  $c_{solar}^{opt}$  and  $c_{wind}^{opt}$  by  $CF_{solar}(t)$  and  $CF_{wind}(t)$ , respectively, and integrating:

$$E_{solar} + E_{wind} = \int_{year} (P_{solar}(t) + P_{wind}(t)) dt$$

$$= \int_{year} (c_{solar}^{opt} \cdot CF_{solar}(t) + c_{wind}^{opt} \cdot CF_{wind}(t)) dt.$$
(S25)

#### Note 3.3 Head-volume-area relationships

Calculating the hydraulic head h(t) for each time step requires knowing the bathymetry and volumearea-depth relationship of each reservoir. Typical curves approximating such relationships need to be calibrated on a reservoir-to-reservoir basis. The user should provide bathymetric curves as input to each simulation. In case these are not available, we recommend using an archetypal reservoir shape function  $^{16,17}$ , modelling reservoirs' area-volume relationships with the equation

$$A(t) = A_{max} \left[ \frac{V(t)}{V_{max}} \right]^{(1 - C_{reservoir})},$$
 (S26)

where  $C_{reservoir} = V_{max}/(A_{max}z_{max})$  is the "reservoir coefficient", and  $A_{max}$  and  $z_{max}$  represent the maximum reservoir lake area and depth, respectively. For any  $V(t + \Delta t)$  calculated using equation (S3), the corresponding  $A(t + \Delta t)$  can then be calculated using equation (S26). To obtain the hydraulic head  $h(t + \Delta t)$  at each time step, the incremental change  $\Delta h(t)$  is added to the head h(t) of the previous time step, using the first-order approximation

$$\Delta h(t) \approx \frac{V(t+1) - V(t)}{A(t)}.$$
 (S27)

When using equation (S26), before any simulation according to CONV or BAL in REVUB, a dummy simulation spanning all possible values of V, and thus of A and h, should be run to obtain a calibration (h, V) curve. In CONV and BAL simulations, the head  $h(t + \Delta t)$  can then always be obtained from this calibration curve after  $V(t + \Delta t)$  has been determined from equation (S3).

#### Note 4 Peaking suitability of large hydropower plants

Since hydropower plants differ in terms of peaking capabilities, operational strategies must be selected with care. If hydropower plants are operated at a too high  $C_{OR}$ , the corresponding peaks in flexible water release may exceed the maximum turbine throughput on a structural basis (cf. equation (S17)), meaning that the plant will be structurally unable to meet peak demand as well as leading to loss of spinning reserves (see Note 7). Typically, this would first occur in the seasons with highest peak demand and/or when water levels are at their lowest. Therefore, each hydropower plant's operation should happen at an optimised value  $C_{OR} = C_{OR}^{opt}$  that ensures this is not the case, while maintaining adequate levels of flexibility. In REVUB, the default procedure (which can be changed by the user) is to define the turbine utilisation rate  $k_{turb}(t)$  at each time step:

$$k_{turb}(t) = \frac{Q_{stable}(t) + Q_{flexible}(t)}{Q_{turb}^{max}},$$
 (S28)

and define hydropower plant operation (at given  $C_{OR}$ ) as unsuitable for peaking purposes when  $p_{99}(k_{turb})$ , i.e. the  $99^{th}$  percentile of  $k_{turb}$ , is unity (in other words, when turbine capacity is fully exhausted in at least one out of every 100 hours).

As default for each hydropower plant, REVUB uses  $C_{OR}^{opt} = C_{OR}^{max}$ , the maximum allowed operational flexibility. If operation is found to be unsuitable for peaking purposes at  $C_{OR}^{max}$ , the REVUB code automatically resimulates with incrementally reduced  $C_{OR}$ , until a value  $C_{OR}^{opt}$  was identified for which  $p_{99}(k_{turb}) < 1$ .

#### Note 5 Reservoir simulation for small hydropower plants

To assess the balancing potential of small hydropower plants, we define the alternative filling time  $\tau_{fill,frac}$  corresponding to the amount of years it would take for a fixed fraction of the incoming flow, denoted  $Q_{in,frac}(t)$ , to fill the reservoir:

$$\tau_{fill,frac} = \frac{V_{max}/T_{year}}{Q_{in,frac}(t)},\tag{S29}$$

where  $Q_{in,frac}(t)$  is defined as

$$Q_{in,frac}(t) = f_{reg}Q_{in,nat}(t), (S30)$$

with  $f_{reg}$  a suitable fraction, determined for each reservoir by solving  $\tau_{fill,frac}=1$ ; that is,  $f_{reg}$  represents the fraction of the incoming water that would take one year to fill the reservoir on average.

The fraction  $Q_{in,frac}(t)$  is then assumed to be "storable" and usable for balancing. REVUB assumes that the remainder of the flow, given by  $Q_{in,nat}(t) - Q_{in,frac}(t) = (1 - f_{reg})Q_{in,nat}(t)$ , passes through the reservoir without being stored, thus representing the seasonal "run-of-river" component  $Q_{RoR}(t)$ . Since  $f_{reg}$  can be calculated based on long-term average flow, such operation can be readily implemented as long as accurate measurements of inflow are available.

The term  $Q_{RoR}$  is appended in equation (S3) (and would be an additional entry under the "water releases" arrows in Fig. S2):

$$V(t + \Delta t) = V(t) + \left[ Q_{in,nat}(t) - Q_{RoR}(t) - Q_{stable}(t) - Q_{flexible}(t) - Q_{spill}(t) + \left[ \pi(t) - \lambda(t) \right] \frac{A(t)}{\rho} \right] \Delta t$$

$$= V(t) + \left[ Q_{in,frac}(t) - Q_{stable}(t) - Q_{flexible}(t) - Q_{spill}(t) + \left[ \pi(t) - \lambda(t) \right] \frac{A(t)}{\rho} \right] \Delta t, \quad (S31)$$

267 and the corresponding seasonal power generation is then equal to

$$P_{RoR}^{hydro}(t) = \min \left[ Q_{RoR}(t); \max \left[ 0; Q_{turb}^{max} - Q_{stable}(t) - Q_{flexible}(t) \right] \right] \eta_{turb} \rho g h(t). \tag{S32}$$

Electricity generation from the hydropower component, denoted  $E_{RoR}^{hydro}$ , is then equal to

$$E_{RoR}^{hydro} = \int_{year} P_{RoR}^{hydro}(t) dt.$$
 (S33)

Dispatching such as described for large hydropower plants in the previous sections is done similarly for small hydropower plants, with the following adaptations: (i) the component  $Q_{in,frac}(t)$  is used as 270 reference flow instead of  $Q_{in,nat}(t)$  in equation (S4); (ii) the rule is added that, as soon as reservoir 271 levels drop precariously low (in this case, below  $f_{restart}V_{max}$ ), the seasonal outflow (if nonzero) is 272 temporarily stopped and the operation reverts to that of large hydropower plants, using the full 273 inflow to stabilise water levels; and (iii) the seasonal power generation  $P_{RoR}^{hydro}(t)$  is not included in 274 equation (S9) as it is not expected to take part in the hour-to-hour load-following. Note, however, 275 that if river discharge would be regulated by other reservoirs upstream in a cascade-like configuration, 276 even  $P_{RoR}^{hydro}(t)$  could become relatively stable throughout the year. 277

#### 278 Note 6 Optional pumped-storage assessment

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The REVUB code can also be used to assess the potential for increasing load-following potential 279 by refurbishing large hydropower plants to pumped-storage schemes <sup>15</sup>, such that excess production 280 (typically of solar PV during mid-day) can be used to pump water back up into the reservoir, enabling 281 the energy to be stored for use at a later stage. This would involve (i) building a downstream reservoir 282 with volume  $V_{lower,max} \ll V_{max}$  to store part of the released water, from which it can be pumped back 283 up into the reservoir, and (ii) ensuring the turbines can be operated in reverse mode and/or pumps 284 are installed. 285 The hydrological balance components then change as follows. First, since environmental flow con-286 287

The hydrological balance components then change as follows. First, since environmental flow constraints still have to be met, only the component  $Q_{flexible}(t)$  can be used for filling the lower reservoir while the component  $Q_{stable}(t)$  has to be directly discharged downstream. The water balance of the lower reservoir is then given by

$$V_{lower}(t + \Delta t) = V_{lower}(t) + [Q_{flexible}(t) - Q_{pump}(t) - Q_{spill,lower}(t)] \Delta t, \tag{S34}$$

where  $Q_{pump}(t)$  is the water pumped back up to the large reservoir for storage, and  $Q_{spill,lower}(t)$  is the overflow component of the lower reservoir. The precipitation and evaporation terms are neglected here as the lower reservoir is assumed to have a much smaller surface area than the upper reservoir.

The water balance of the large reservoir is then given (cf. equation (S3)) by

$$V(t+\Delta t) = V(t) + \left[Q_{in,nat}(t) - Q_{stable}(t) - Q_{flexible}(t) + Q_{pump}(t) - Q_{spill}(t) + \left[\pi(t) - \lambda(t)\right] \frac{A(t)}{\rho}\right] \Delta t, \text{ (S35)}$$

and the net outflow of the pumped-storage plant is given (cf. equation (S2)) by

$$Q_{out}(t) = Q_{stable}(t) + Q_{spill}(t) + Q_{spill,lower}(t).$$
(S36)

A schematic of this operation is shown in Fig. S3 (cf. Fig. S2). Note that pumped-storage operation is only useful for large hydropower plants, as small plants have to continuously discharge during large parts of the year to prevent spillage, and pumping water back up would thus not serve a purpose. The component  $Q_{pump}(t)$  is calculated as follows. The power stored by pumping is given by

$$P_{pump}(t) = \left\{ \begin{array}{ll} 0, & \text{for } P_d(t) < 0 \\ \min \left[ Q_{pump}^{pot}(t) \eta_{pump}^{-1} \rho g h(t); \min \left[ P_d(t); P_{pump}(t-1) + \Delta P_{pump}^{ramp} \right] \right], & \text{for } P_d(t) \ge 0 \& \Delta P_d(t) \ge 0 \\ \min \left[ Q_{pump}^{pot}(t) \eta_{pump}^{-1} \rho g h(t); \max \left[ P_d(t); P_{pump}(t-1) - \Delta P_{pump}^{ramp} \right] \right], & \text{for } P_d(t) \ge 0 \& \Delta P_d(t) < 0 \end{array} \right\}, \quad (S37)$$

where  $\Delta P_{pump}^{ramp}$  is the maximum ramp rate for pumping,  $\eta_{pump}$  is the pumping efficiency, and

$$Q_{pump}^{pot}(t) = \min \left[ \frac{V_{lower}(t)}{\Delta t}; Q_{pump}^{max} \right]$$
 (S38)

with  $Q_{pump}^{max}$  the maximum pump throughput. The flow pumped back into the reservoir then equals

$$Q_{pump}(t) = \frac{P_{pump}(t)}{\eta_{pump}^{-1}\rho gh(t)}.$$
 (S39)

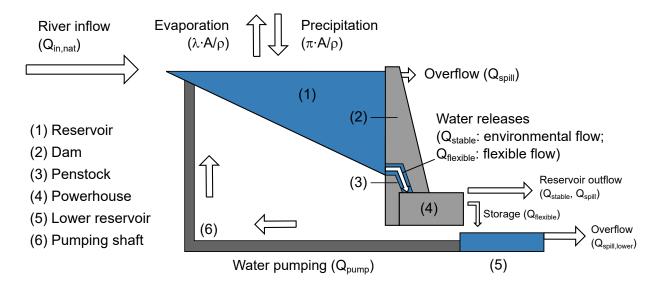


Figure S3: Flowchart of the water gains and losses of a large hydropower plant, including pumped storage. Water gains and losses of a hydropower plant modelled as pumped-storage plant, with an additional lower reservoir and a flow of water in the upstream direction for temporary energy storage.

Finally, the overflow component of the lower reservoir is calculated as

$$Q_{spill,lower}(t) = \left\{ \begin{array}{ll} 0, & \text{for } (V_{lower,max} - V_{lower}(t)) / \Delta t \geq Q_{flexible}(t) \\ Q_{flexible}(t) - (V_{lower,max} - V_{lower}(t)) / \Delta t, & \text{for } (V_{lower,max} - V_{lower}(t)) / \Delta t < Q_{flexible}(t) \\ \end{array} \right\}. \tag{S40}$$

Since the pumping allows a certain fraction of the water to be recycled for power generation, the values  $c_{solar}^{opt}$  and  $c_{wind}^{opt}$  resulting from the optimisation described in Note 3.2 will end up higher as compared to a situation without pumping component. In this way, pumped storage can help increase the load that can be carried by the hydro-solar-wind combination.

The REVUB code includes an optional section to perform the above operations and the required optimisation (this scenario is named "STOR" in the code, as opposed to "CONV" and "BAL").

#### Note 7 Meeting spinning reserve requirements

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In electricity networks, a certain reserve capacity, to be utilised in case of disruptions of supply, must always be available. The reserve capacity that is already online is denoted the spinning reserve, of which hydropower plants with reservoirs are typical providers. However, the flexible hydropower operation modeled by REVUB requires hydropower output to be increased during certain intervals to compensate for reductions in solar and/or wind power; thus, the remaining spinning reserves available to manage contingencies will consistently reach minimum values during those times.

The question is thus whether the hydropower plants could still respond to contingency events (e.g. failure of a transmission line leading to a solar power park temporarily being disconnected), despite being operated by flexible rule curves that lead to regular minima in the available spinning reserves. The spinning reserves  $P_{spin}(t)$  from all hydropower plants within a certain geography can be calculated as

$$P_{spin}(t) = \sum_{\substack{\text{all hydro} \\ \text{plants}}} \left[1 - CF_{hydro}(t)\right] P_{turb}^{r} \Gamma(t), \tag{S41}$$

where  $\Gamma(t)$  equals zero if the hydropower plant has temporarily undergone a drought-related shutdown, and unity otherwise; and  $CF_{hydro}(t)$  is the capacity factor of each hydropower plant, calculated as

$$CF_{hydro}(t) = \frac{P_{stable}^{hydro}(t) + P_{flexible}^{hydro}(t) + P_{RoR}^{hydro}(t)}{P_{turb}^{r}}.$$
 (S42)

To test the ability of hydropower to respond to supply disruptions of the added solar and wind power, the user should (ex-post) calculate the ratio (denoted  $\nu$ ) of  $P_{spin}(t)$  to the total solar and wind power generation assumed to feed into the same grid. Typical benchmarks of spinning reserve needs for high-RE systems are in the order of  $\nu \sim 10-20\%^{18}$ .

# Note 8 Glossary

The table below provides an overview of all described parameters used in the REVUB model and its inputs and outputs. The symbol of each parameter is provided alongside its unit, a description of what it represents in the model, its data type (constant, variable, time series), its use in the model (as input, output, intermediate result, or used for preparing input), and its applicability across various components of the model. Here, "scenario" denotes a certain simulation setting: different scenarios may have different solar/wind mixes, different constraints on overproduction, different pools of hydropower plants contributing to flexibility, etc.

| Symbol                   | Unit     | Description   | Type         | Used as/for    | Applicable to                               |
|--------------------------|----------|---|--------------|----------------|---|
| A(t)                     | $m^2$    | Reservoir lake surface area   | Time series  | Output         | each hydropower plant & each scenario       |
| $A_{max}$                | $m^2$    | Maximum reservoir lake surface area   | Constant     | $_{\rm Input}$ | each hydropower plant                       |
| $C_{OR}$                 | -        | Operating reserve coefficient: Fraction of yearly reservoir inflow available for flexible use   | Variable     | -              | each hydropower plant                       |
| $C_{OR}^{max}$           | -        | Maximum allowed operating reserve coefficient taking into account environmental flow needs  | Constant     | Input          | general                                     |
| $C_{OR}^{opt}$           | =        | Optimal operating reserve coefficient   | Constant     | Output         | each hydropower plant & each scenario       |
| $c_{solar}$              | MW       | Installed capacity of solar panels  | Constant     | Output         | each hydropower plant & each scenario       |
| $c_{solar}^{opt} \\$     | MW       | Optimal installed solar power capacity needed to follow optimal load $L_{opt}(t)$   | Constant     | Output         | each hydropower plant & each scenario       |
| $c_{wind}$               | MW       | Installed capacity of wind turbines   | Constant     | Output         | each hydropower plant & each scenario       |
| $c_{wind}^{opt} \\$      | MW       | Optimal installed wind power capacity needed to follow optimal load $L_{opt}(t)$  | Constant     | Output         | each hydropower plant & each scenario       |
| $CF_{hydro}(t)$          | =        | Capacity factor of hydropower plants  | Time series  | Output         | each hydropower plant & each scenario       |
| $CF_{solar}(t)$          | =        | Weighted average capacity factor of solar panels across locations   | Time series  | Input          | each scenario                               |
| $CF^n_{solar}(t)$        | =        | Capacity factor of solar panels in each location with index $\boldsymbol{n}$  | Time series  | Input          | each solar power site                       |
| $CF_{wind}(t)$           | =        | Weighted average capacity factor of wind turbines across locations  | Time series  | Input          | each scenario                               |
| $CF^n_{wind}(t)$         | =        | Capacity factor of wind turbines in each location with index $\boldsymbol{n}$   | Time series  | Input          | each wind power site                        |
| $d_{min}$                | =        | Percentage of average reservoir inflow required as minimum environmental outflow  | Constant     | Input          | general                                     |
| $\Delta P_{turb}^{ramp}$ | MW/min   | Maximum ramp rate of hydropower plant   | Constant     | Input          | general                                     |
| $\Delta P_{pump}^{ramp}$ | MW/min   | When simulating pumped-storage potential:<br>Maximum ramp rate of pumps   | Constant     | Input          | general                                     |
| $E_{reservoir}^{hydro}$  | GWh/year | Total yearly hydropower generation  | Yearly total | Output         | each hydropower plant & each scenario       |
| $E_{stable}^{hydro}$     | GWh/year | Total yearly hydropower generation from stable reservoir outflow component  | Yearly total | Output         | each hydropower plant & each scenario       |
| $E_{flexible}^{hydro}$   | GWh/year | Total yearly hydropower generation from flexible reservoir outflow component  | Yearly total | Output         | each hydropower plant & each scenario       |
| $E_{RoR}^{hydro}$        | GWh/year | Total yearly hydropower generation from seasonal run-of-river outflow component   | Yearly total | Output         | each small hydropower plant & each scenario |
| $E_{solar}$              | GWh/year | Total yearly solar power generation   | Yearly total | Output         | each hydropower plant & each scenario       |
| $E_{wind}$               | GWh/year | Total yearly wind power generation  | Yearly total | Output         | each hydropower plant & each scenario       |
| ELCC                     | GWh/year | Effective Load Carrying Capability. Total yearly load followed by hydro-solar-wind without loss of load, ensuring long-term lake level stability, and meeting environmental flow requirements. Integral of $L_{followed}(t)$ over all time steps in a year. | Yearly total | Output         | each hydropower plant & each scenario       |
| $\mathrm{ELCC}_{tot}$    | GWh/year | Aggregate of ELCC across all power plants. Also called "total load-following potential" of hydrosolar-wind.   | Yearly total | Output         | each scenario                               |
| $\eta_{turb}$            | -        | Hydroturbine conversion efficiency  | Constant     | Input          | general                                     |
| $\eta_{pump}$            | -        | When simulating pumped-storage potential: Pumping efficiency  | Constant     | Input          | general                                     |

| Symbol  | Unit                      | Description   | Туре                              | Used as/for          | Applicable to   |
|---|---------------------------|---|-----------------------------------|----------------------|---|
| $f_{opt}$   | =                         | Optimal filling fraction of hydropower reservoir  | Constant                          | Input                | general   |
| $f_{spill}$                                       | -                         | Reservoir filling fraction at which overflow prevention via spillways is initiated  | Constant                          | Input                | general   |
| $f_{stop}$  | -                         | Low reservoir filling fraction at which hydropower generation is curtailed  | Constant                          | Input                | general   |
| $f_{restart}$                                     | -                         | Reservoir filling fraction at which hydropower generation is restarted after curtailment  | Constant                          | Input                | general   |
| $f_{reg}$   | -                         | Fraction of natural inflow that gives filling time equal to unity   | Constant                          | Intermediate         | each small hydropower plant                                   |
| g   | $\mathrm{m/s^2}$          | Gravitational acceleration  | Constant                          | Input                | general   |
| $\gamma$  | -                         | Conventional reservoir rule parameter   | Constant                          | Input                | general   |
| $\Gamma(t)$                                       | -                         | Binary function indicating whether hydropower plant is operating $(1)$ or not $(0)$   | Time series                       | Output               | each hydropower plant & each scenario                         |
| h(t)  | m                         | Hydraulic head: Difference in water level between headwater (behind the dam) and tailwater (at the turbines)                        | Time series                       | Output               | each hydropower plant & each scenario                         |
| $h_{max}$   | m                         | Maximum hydraulic head of hydropower scheme   | Constant                          | Input                | each hydropower plant   |
| $k_{turb}(t)$                                     | -                         | Hydroturbine utilisation rate   | Time series                       | Output               | each hydropower plant & each scenario                         |
| κ   | -                         | Conventional reservoir rule parameter   | Constant                          | Input                | general   |
| L(t)  | MW                        | Load to be followed   | Time series                       | Intermediate         | each scenario   |
| $L_{opt}(t)$                                      | MW                        | Optimal load to be followed by hydro-solar-wind mix, ensuring long-term reservoir lake level stability                              | Time series                       | Output               | each hydropower plant & each scenario                         |
| $L_{followed}(t)$                                 | MW                        | Actual followed load under optimal solution at zero loss of load (ideally equal to $L_{opt}(t)$ )                                   | Time series                       | Output               | each hydropower plant & each scenario                         |
| $L_{res}(t)$                                      | MW                        | Residual load: Difference between actual followed load and total hydro-solar-wind power generation                                  | Time series                       | Intermediate         | each hydropower plant & each scenario                         |
| $L_{norm}(t)$                                     | =                         | Normalised load curve shape   | Time series                       | Input                | each scenario   |
| $\lambda(t)$                                      | ${\rm kg/m^2/s}$          | Evaporation flux on reservoir lake surface  | Time series                       | Input                | each hydropower plant   |
| $\mu$   | =                         | Constant used in modelling overflow prevention via spillways  | Constant                          | Input                | general   |
| n   | -                         | Index for different locations of solar and wind power generation  | Index                             | -                    | solar power and wind<br>power sites                           |
| $N_{solar}$                                       | -                         | Total number of solar power generation sites connected to the same power grid   | Constant                          | Input                | each scenario   |
| $N_{wind}$  | =                         | Total number of wind power generation sites connected to the same power grid  | Constant                          | Input                | each scenario   |
| u(t)  | -                         | Ratio of spinning reserves to total solar and wind power generation   | Time series                       | Output               | each hydropower plant & each scenario                         |
| $P_{turb}^{r}$                                    | MW                        | Rated hydroturbine capacity   | Constant                          | Input                | each hydropower plant   |
| $P_{stable}^{hydro}(t)$ $P_{flexible}^{hydro}(t)$ | MW<br>MW                  | Power generated by stable component of reservoir<br>outflow  Power generated by flexible component of reser-                        | Time series Time series           | Output Output        | each hydropower plant & each scenario each hydropower plant & |
| $P_{RoR}^{hydro}(t)$                              | MW                        | voir outflow  Power generated by seasonal run-of-river compo-   | Time series                       | Output               | each small hydropower   |
| $P_{inflexible}(t)$                               | MW                        | nent of reservoir outflow  Inflexible power generation (stable hydro + solar  | Time series                       | Intermediate         | plant & each scenario each hydropower plant &                 |
| $P_{solar}(t)$                                    | MW                        | + wind)  Solar power generation   | Time series                       | Output               | each scenario each hydropower plant &                         |
| $P_{wind}(t)$                                     | MW                        | Wind power generation   | Time series                       | Output               | each scenario each hydropower plant &                         |
| $P_{followed}$                                    | MW                        | Average actual followed load under optimal solu-  | Constant                          | Output               | each scenario each hydropower plant &                         |
| $P_{load}$  | MW                        | tion  Average load to be followed   | Constant                          | Intermediate         | each scenario each hydropower plant &                         |
| $P_{spin}(t)$                                     | MW                        | Spinning reserves available from all hydropower   | Time series                       | Output               | each scenario each hydropower plant &                         |
| $P_{pump}(t)$                                     | MW                        | When simulating pumped-storage potential:   | Time series                       | Output               | each large hydropower   |
| $P_d(t)$  | MW                        | Power used for pumping  Difference between total inflexible power generation (stable hydro + solar + wind) and to-be- followed load | Time series                       | Output               | plant & each scenario each hydropower plant & each scenario   |
| $\phi$  | -                         | Conventional reservoir rule parameter   | Constant                          | Input                | general   |
| $\pi(t)$  | ${\rm kg/m^2/s}$          | Precipitation flux on reservoir lake surface  | Time series                       | Input                | each hydropower plant   |
| $\Psi$  | -                         | Relative deviation between simulated lake levels<br>under balancing-oriented and conventional oper-                                 | Function of $c_{solar}, c_{wind}$ | Intermediate         | each hydropower plant & each scenario                         |
| $Q_{in,frac}(t)$                                  | $\mathrm{m}^3/\mathrm{s}$ | ation, respectively  Part of natural inflow that gives filling time equal to unity  | Time series                       | ${\bf Intermediate}$ | each small hydropower<br>plant                                |

| Symbol                       | Unit           | Description   | Type        | Used as/for  | Applicable to                                  |
|------------------------------|----------------|---|-------------|--------------|--|
| $Q_{in,nat}(t)$              | $m^3/s$        | Natural river discharge into reservoir  | Time series | Input        | each hydropower plant                          |
| $Q_{out}(t)$                 | $m^3/s$        | Total reservoir outflow, consisting of stable, flexible, run-of-river and spilling components                                       | Time series | Output       | each hydropower plant & each scenario          |
| $Q_{stable}(t)$              | $m^3/s$        | Stable component of reservoir outflow   | Time series | Output       | each hydropower plant & each scenario          |
| $Q_{flexible}(t)$            | $m^3/s$        | Flexible component of reservoir outflow   | Time series | Output       | each hydropower plant & each scenario          |
| $Q_{RoR}(t)$                 | $m^3/s$        | Seasonal run-of-river component of reservoir outflow (zero for large hydropower plants)   | Time series | Output       | each small hydropower plant                    |
| $Q_{spill}(t)$               | $m^3/s$        | Spilling component of reservoir outflow   | Time series | Output       | each hydropower plant & each scenario          |
| $Q_{turb}^{max} \\$          | $m^3/s$        | Maximum hydroturbine throughput   | Constant    | Input        | each hydropower plant                          |
| $Q_{turb,flexible}^{pot}(t)$ | $m^3/s$        | Maximum potential outflow available for flexi-<br>ble hydropower generation, before accounting for<br>needs and ramping constraints | Time series | Intermediate | each hydropower plant & each scenario          |
| $Q_{pump}(t)$                | $m^3/s$        | When simulating pumped-storage potential: Pumped flow   | Time series | Output       | each large hydropower<br>plant & each scenario |
| $Q_{pump}^{max} \\$          | $m^3/s$        | When simulating pumped-storage potential:<br>Maximum pumping throughput   | Constant    | Input        | each large hydropower<br>plant                 |
| ho                           | ${\rm kg/m^3}$ | Density of water  | Constant    | Input        | general  |
| t                            | hours          | Time  | Variable    | -            | general  |
| $T_{year}$                   | seconds        | Number of seconds in a year   | Constant    | Input        | general  |
| $	au_{fill}$                 | -              | Filling time: number of years it takes (on average) to fill reservoir with natural inflow   | Constant    | Intermediate | each hydropower plant                          |
| $	au_{fill,frac}$            | -              | Filling time: number of years it takes (on average) to fill reservoir with fraction $f_{reg}$ of natural inflow                     | Constant    | Intermediate | each small hydropower<br>plant                 |
| V(t)                         | $m^3$          | Volume of water in reservoir  | Time series | Output       | each hydropower plant & each scenario          |
| $V_{max}$                    | $m^3$          | Maximum reservoir volume  | Constant    | Input        | each hydropower plant                          |
| $V_{lower}(t)$               | $m^3$          | When simulating pumped-storage potential: Volume of lower reservoir   | Time series | Output       | each large hydropower<br>plant & each scenario |
| $V_{lower,max}$              | $m^3$          | When simulating pumped-storage potential:<br>Maximum volume of lower reservoir  | Constant    | Input        | each large hydropower<br>plant                 |
| $w^n_{solar}$                | -              | Weight factor for capacity to be installed in each solar power site   | Constant    | Input        | each solar power site                          |
| $w_{wind}^n$                 | -              | Weight factor for capacity to be installed in each wind power site  | Constant    | Input        | each wind power site                           |
| $z_{max}$                    | m              | Maximal reservoir depth   | Constant    | Pre-input    | each hydropower plant                          |

## Note 9 Running the model: Input (A)

- The initialisation of the REVUB simulation is done through the file A\_REVUB\_initialise\_minimum\_example.

  In this file, all parameters that should be defined by the user are indicated by [Set by user]. This

  includes various types of data:
  - Time-related parameters and model parameters referring to the number of hydropower plants to simulate, the length of the time series to simulate, and various quantities used in the hydropower modelling, according to the equations introduced in this Manual which are all referenced to their equation number in the code. These quantities are the same across all hydropower plants to be modelled;
  - Static parameters, which are constants specific to each hydropower plant, and thus to be entered as 1-dimensional arrays with length equal to the number of hydropower plants for which to run a simulation, with each element representing the corresponding value for the corresponding hydropower plant;
  - Time series of important parameters whose value needs to be known for each time step before a simulation can be performed, namely reservoir inflow, evaporation, precipitation, solar/wind power capacity factor, and the shape of the electricity demand profile. These values should be read in by the code as 3-dimensional matrices, with the following dimensions: [number of time slices (default: hours) per year; number of years covered by the simulation; number of

hydropower plants included in the simulation."

• Bathymetric relationship for the modelled hydropower plants. These values should be read in by the code as an array with three columns and a user-determined number of rows; the first column should represent reservoir volume, and the second and third column the corresponding area and hydraulic head values.

#### Note 10 Running the model: Core code (B)

The actual core code of REVUB is contained in the file B\_REVUB\_main\_code. Once the input data has been loaded using the file A\_REVUB\_initialise\_minimum\_example, the user can principally run this core code directly. The first lines of this code contain several parameters related to accuracy and speed of computation denoted [Set by user], which can be tuned by the user if needed:

- N\_ELCC determines the accuracy (the number of discrete steps between zero and maximum power generation) with which the zero-crossing of  $L_{res}$  in equation (S22) is determined.
- f\_init\_BAL\_start, f\_init\_BAL\_step and f\_init\_BAL\_end determine the range (start, step size, and end) of  $E_{solar} + E_{wind}$  (cf. equation (S25)), expressed as a fraction of  $E_{reservoir,CONV}^{hydro}$  (cf. equation (S24)), in which the REVUB code starts searching for the solution to equation (S21). Note that the code gives a warning message to the user in case this range turns out to be inadequate (i.e. if no global minimum in Ψ is found). The same ranges should also be given for STOR scenarios (f\_init\_STOR\_start, f\_init\_STOR\_step and f\_init\_STOR\_end) in case the user wishes to model these.
- N\_refine\_BAL determines the accuracy with which the solution to equation (S21) is determined. After the initial search for this minimum in the range [f\_init\_BAL\_start: f\_init\_BAL\_step: f\_init\_BAL\_end] (see previous point), the REVUB model can zoom in to the range around this minimum to identify its value with increased accuracy, using a step size reduced by a factor of ten. The number of times with which this is done is determined by N\_refine\_BAL. Thus, N\_refine\_BAL = 1 means that the initial search is deemed accurate enough, whereas each +1 in N\_refine\_BAL increases the accuracy of identification of the minimum in Ψ by one digit. Accordingly, each +1 also increases computation time proportionally. For users wishing to model STOR scenarios, the same principle applies to N\_refine\_STOR.
- psi\_min\_threshold is zero by default, but can be set higher to speed up computation time in case the search for the minimum in  $\Psi$  takes too long. This parameter ensures that the zooming-in to higher accuracies (see previous point) is stopped as soon as  $\min(\Psi)$  ends up below psi\_min\_threshold. It can thus be a compromise for users wishing to have high accuracy of determining  $\min(\Psi)$  (i.e. setting N\_refine\_BAL/STOR > 1) but not at a high cost of computational speed.
- X\_max\_BAL determines the amount of iterative loops employed by the model to get a converged estimate of  $P_{stable,BAL}^{hydro}$  (cf. equation (S9) and the explanation below equation (S19)). Each +1 also increases computation time proportionally. For users wishing to model STOR scenarios, the same principle applies to X\_max\_STOR.

#### Note 11 Running the model: Output graphics (C)

The results of the REVUB simulation are post-processed with two separate files, named C\_REVUB\_plotting and C\_REVUB\_plotting\_multiple, which generate several standardised figures based on the input and output of the model. The two files serve a somewhat different purpose:

<sup>&</sup>lt;sup>v</sup>Note that the REVUB code is designed to take into account the extra days occurring in leap years; for the purposes of preparing these data sets, if the simulation period contains leap years, the number of elements along the first dimension of these matrices should thus reflect the number of time slices (hours) in a leap year, and the data for non-leap years should be appended with *nan* values to reach the same length.

- The file C\_REVUB\_plotting\_individual is used to plot simulation results pertaining to a single (user-selected) hydropower plant.
  - The file C\_REVUB\_plotting\_multiple is used to aggregate simulation results pertaining to (a user-selected set of) all hydropower plants. Based on a user-defined total electricity demand, it shows how much of this total demand can be met by hydro-solar-wind power on all involved timescales, and how much would remain to be met by other power sources.

#### Note 11.1 Results for individual power plants

The figures generated by the file C\_REVUB\_plotting\_individual are described below.

- Figure 1 shows (a) the (h, V) and (b) the (A, V) bathymetric calibration curves used as input to the model.
- Figure 2 shows (a) the full time series of hydraulic head h(t) under CONV, BAL and (if modelled) STOR, (b) the frequency spectrum of these hydraulic head curves such that e.g. specific temporal signatures, such as diurnal dispatch in solar-heavy systems, can be discerned, and (c) the monthly median and interquartile ranges of natural inflow  $Q_{in,nat}(t)$  and outflow  $Q_{out}(t)$  (equation S2) under CONV, BAL and (if modelled) STOR.
- Figure 3 shows (a) the full time series of lake volume V(t) under CONV, BAL and (if modelled) STOR, and (b) the monthly average time series of natural inflow  $Q_{in,nat}(t)$  and outflow  $Q_{out}(t)$  under CONV, BAL and (if modelled) STOR.
- Figure 4 shows the monthly average composition of the hydro-solar-wind mix supported by the selected hydropower plant, under the BAL scenario and for a user-defined year (see below). The figure indicates hydropower generation (by stable, flexible and RoR components) and the optimal solar and wind power contribution identified by REVUB. The achieved ELCC, whose profile reflects that of  $L_{norm}(t)$ , is also indicated. In case a STOR scenario was simulated, a corresponding extra figure will be produced for that scenario, additionally indicating the pump-stored part of solar/wind power generation.
- Figure 5 is analogous to Figure 4, but at yearly resolution and reflecting the entire simulated time series.
- Figure 6 is analogous to Figure 4, but at hourly (full) resolution for a user-defined time slice (see below).
  - Figure 7 shows approximated reservoir release rules in the BAL scenario for a user-defined hour of the day during a user-defined month. The plot shows the median and interquartile range of needed reservoir release (minus the RoR and spill components, i.e.  $Q_{stable} + Q_{flexible}$ ) versus the median hydraulic head, with each data point denoting results from one simulation year. A linear fit to these data points is also shown.

At the beginning of the code, a few parameters denoted [Set by user] can be changed to adapt the data to be plotted. These are as follows:

- plot\_HPP is the index of the hydropower plant for which to plot results in all Figures.
- plot\_year is the index of the simulation year for which to plot results in Figures 4 and 6.
  - plot\_month is the month in which to start the time slice in Figure 6.
- plot\_day\_month is the day of the month defined by plot\_month on which to start the time slice in Figure 6.
- plot\_num\_days is the number of days for which to plot results in Figure 6.

- plot\_rules\_month is the month(s) of the year for which to plot results in Figure 7. This can be an array, e.g. [1, 4] would denote that the curves in Figure 7 are plotted both for January and for April.
  - plot\_rules\_hr is the hour(s) of day during the month defined by plot\_rules\_month for which to plot results in Figure 7. This can be an array, e.g. [8, 20] would denote that the curves in Figure 7 are plotted both for 8 a.m. and 8 p.m.

#### Note 11.2 Results for multiple power plants

The file C\_REVUB\_plotting\_multiple serves to show to what extent the investigated hydropower, solar power and wind power plants could contribute to the overall power mix of a given territory. The principle of this file is as follows:

- To run the file, the user must first define an overall electricity demand curve, denoted P\_total\_hourly (see below).
- The file then plots the aggregate power generation from all investigated hydro, solar and wind plants under BAL and STOR, and compares it to P\_total\_hourly.
- Any shortfalls in renewable power generation are then assumed to be filled up by thermal power plants. This reflects the assumption of a priority of dispatch for renewables.
- When renewable power generation exceeds P\_total\_hourly by a certain amount, this amount is assumed to be curtailed.

In this way, the file allows to calculate the total power mix (hydro/solar/wind/thermal) suggested by the streamlined hydro-solar-wind operation as simulated by REVUB.

The figures produced by the file are described below.

- Figure 1 shows the monthly average composition of the hydro-solar-wind mix under the BAL scenario for a user-defined year (see below). The figure indicates the total power demand P\_total\_hourly, and how this power demand is met by the aggregate hydropower generation (by stable, flexible and RoR components) from all hydropower plants, the aggregate of all solar and wind power, and the necessary other (thermal) power generation. Any curtailed solar/wind power is shown as such. The curve representing ELCC<sub>tot</sub> is also included. In case a STOR scenario was simulated, a corresponding extra figure will be produced for that scenario, additionally indicating the pump-stored part of solar/wind power generation. (In this case, small hydropower plants for which no STOR scenario is available (cf. section Note 6) are included according to their BAL results.)
- Figure 2 is analogous to Figure 1, but at yearly resolution and reflecting the entire simulated time series.
- Figure 3 is analogous to Figure 1, but at hourly (full) resolution for a user-defined time slice (see below).

At the beginning of the code, a few parameters denoted [Set by user] can be changed to adapt the data to be plotted. These are as follows:

- plot\_HPP\_multiple is an array containing the indices of the hydropower plants whose results are to be aggregated in the Figures. The user can thus select all, or a selection of, the simulated hydropower plants.
- plot\_year\_multiple is the index of the simulation year for which to plot results in Figures 1 and 3.
- plot\_month\_multiple is the month in which to start the time slice in Figure 3.

- plot\_day\_month\_multiple is the day of the month defined by plot\_month on which to start the time slice in Figure 3.
  - plot\_num\_days\_multiple is the number of days for which to plot results in Figure 3.
  - P\_total\_hourly is the total power demand (for all time steps of the simulation) against which the hydro-solar-wind power generation is compared. We recommend that this is taken to be equal to  $P_{total}^{av}L_{norm}(t)$  (cf. equation (S10)), with  $P_{total}^{av}$  the average total power demand (in MW), to be specified by the user.

## Note 12 Examples of model use

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- The REVUB model has so far been used for the following publications/documents:
- S. Sterl, I. Vanderkelen, C.J. Chawanda, D. Russo, R.J. Brecha, A. van Griensven, N.P.M. van Lipzig, and W. Thiery (2020). Smart renewable electricity portfolios in West Africa. *Nature Sustainability* (accepted for publication).
  - S. Sterl, P. Donk, P. Willems, and W. Thiery (2020). Turbines of the Caribbean: Decarbonising Suriname's electricity mix through hydro-supported integration of wind power. (In preparation.)

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