



Frequency control studies: A review of power system, conventional and renewable generation unit modeling

Ana Fernández-Guillamón^a, Eduard Muljadi^b, Angel Molina-García^{c,*}

^a Department of Electrical, Electronics and Automatics Engineering, and Applied Physics, Universidad Politécnica de Madrid, 28012 Madrid, Spain

^b Department of Electrical and Computer Engineering, Auburn University, 220 Broun Hall, Auburn, AL 36849, USA

^c Department of Automatics, Electrical Eng. and Electronic Tech., Universidad Politécnica de Cartagena, 30202 Cartagena, Spain

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ABSTRACT

Over the last decades, renewable energy sources have increased considerably their generation share in power systems. As a consequence, in terms of frequency deviations, both grid reliability and stability have raised interest. By considering the absence of a consensual set of models for frequency control analysis, both for the different generation units (conventional and renewables) and the power system itself, this paper provides extensive and significant information focused on the models and parameters for studies about frequency control and grid stability. An extensive analysis of supply-side and power system modeling for frequency stability studies over the last decade is presented and reviewed. Parameters commonly used and assumed in the specific literature for such simulations are also given and compared. Modeling of generation units are described as well, including both conventional and renewable power plants.

1. Introduction

Frequency is a crucial parameter in power systems. Imbalances between supply and demand cause deviations from the nominal frequency: a supply-side excess yields an increase in frequency, while a demand-side excess results in a decrease in frequency [1]. Under large grid frequency deviations, statutory and operational limits can be breached, forcing generators to disconnect and resulting in catastrophic failures within the system [2]. With the increasing integration of renewable sources into power systems, it is expected that frequency events severity becomes more and more important as conventional units are supplanted by renewable generators [3]. In fact, and apart from the intermittent nature of renewables, most of these renewable resources are decoupled from the grid. Consequently, they do not contribute to the system inertia, commonly considered as one of the crucial grid parameters to ensure a synchronized operation of current power systems [4]. Indeed, according to Dreidy et al. [5], an inertia reduction of 70% is expected between 2014–2034 as a result of the renewable integration, thus needing a more ‘flexible’ power system [6]. Table 1 compares dispatchable generation units in terms of flexibility dimensions: *Min. generation* refers to the minimum stable output power that a power plant can achieve, expressed as a percentage of their nominal output capacity; *Ramp rate* represents the maximum power per minute a power plant can increase or decrease its generation (in percentage of the nominal output capacity); and *Start-up time*

Table 1

Conventional power plant characteristics according to [7].

Power plant	Min. generation (%)	Ramp rate (%/min)	Start-up time (h)
Steam turbine (gas/oil)	30–60	2–8	3–8
Nuclear	90	2	24
CCGT	40	8	3
Hydro	0–50	5–15	0.16
Bioenergy	50	8	3

corresponds to the start-up of the power plant from warm conditions (i.e., 8 to 60 h of shutdown) [7]. As can be seen, these power plants show relevant differences in their technical flexibility, which should be considered for future high renewable energy source integration into power systems [8].

In the specific literature, there are many studies focused on frequency control, power system stability, and imbalance scenarios. Fig. 1 depicts the main elements usually considered in such studies. Due to the increased penetration of renewables in current electrical grids, different authors have proposed and assessed inertial response capability from them during the last decade [9,10], mainly wind power plants [11,12] and PV installations [13,14]. However, these contributions usually evaluate power systems’ stability through different power systems and

* Corresponding author.

E-mail address: angel.molina@upct.es (A. Molina-García).

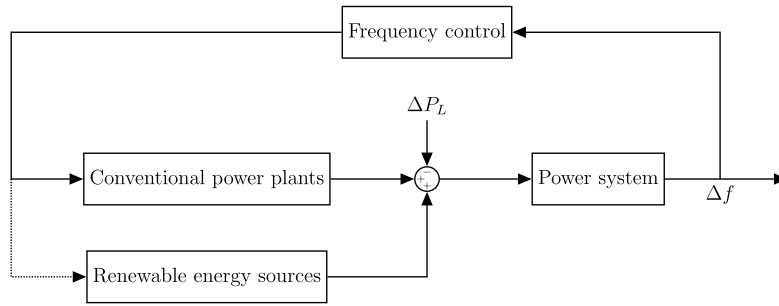


Fig. 1. General overview.

generation units' models, together with different scenarios and power imbalances, thus making it difficult to compare the results of the frequency control strategies proposed in different studies. In addition, a variety of models for the same generation units are usually considered by the authors.

Under this framework, this paper describes and compares power system and generation units' modeling for frequency control analysis based on an extensive literature review for the last decade, including the parameters commonly used in previous contributions – both for conventional and renewable generation unit modeling –. The specific frequency control strategies are not included, as several reviews focused on both conventional and renewable energy sources are available in the specific literature [5,15–20]. Most of the models presented in this paper are linear (based on transfer functions) to obtain time-domain responses. Subsequently, these models are suitable to analyze the system behavior under small-signal stability [21], even though current studies also use such models to analyze the loss of the largest power plant, providing proper results [22–24]. Consequently, and despite the models can be used to simulate severe power imbalances, they are not robust enough to variations in the operating conditions. Moreover, it should be noticed that these models should be used for qualitative studies, and may lack the precision needed by Transmission System Operators (TSO) [25], who can perform a fully nonlinear simulation of the power system behavior.

The rest of the paper is structured as follows. Section 2 provides the models and parameters most commonly adopted for the power systems modeling focused on frequency stability analysis. In Section 3, the models and parameters of conventional power plants are discussed. Models and parameters about renewable sources are presented in Section 4. Section 5 compares the different values for the parameters, to understand how they affect the simulation results. Section 6 presents the discussion. Finally, conclusions are given in Section 7.

2. Power system modeling for frequency analysis

According to the specific literature, most frequency oscillation studies propose an equivalent power system model by considering the swing equation, in which all grid synchronous generators are summarized in an equivalent rotating mass, with an equivalent inertia constant H_{eq} [26]. This H_{eq} is estimated with:

$$H_{eq} = \frac{\sum_{i=1}^{SG} H_i \cdot S_{B,i}}{S_B}, \quad (1)$$

where H_i and $S_{B,i}$ are the inertia constant and rated power of the synchronous generator i (respectively), SG is the total number of synchronous generators connected to the grid, and S_B is the rated power of the power system [21]. Hence, the swing equation of the power system is [27–42]:

$$\Delta f = \frac{1}{(2 \cdot H_{eq}) \cdot s + D} \cdot (\Delta P_g - \Delta P_L), \quad (2)$$

where H_{eq} [s] is the equivalent inertia of the grid, and D [W/Hz] is the damping factor, which models the dependency of loads power to frequency [43], even though there are more “damping elements” in a power system (i.e., speed governing, excitation system, etc.) [44]. Other authors replace $2 \cdot H_{eq}$ by M [s] [45–54], and other contributions propose and use the following expression [55–64],

$$\Delta f = \frac{K_p}{T_p \cdot s + 1} \cdot (\Delta P_g - \Delta P_L), \quad (3)$$

being $K_p = 1/D$ [Hz/W] and $T_p = 2 \cdot H_{eq}/D$ [W⁻¹]. Consequently, regardless of the equation used, both H_{eq} and D are crucial parameters for the power system stability, as both reduce the impact of power variations in frequency [3]. The models corresponding to Eqs. (2) and (3) are shown in Fig. 2. Tables 2 and 3 summarize values found in the literature for H_{eq} and D sorted in chronological order, also including the H_{eq} values of those studies where $H_{eq} = M/2$. From the information given in Table 2, a wider range of inertia values can be even found in [34], which suggested $H_{eq}=21.08$ s for grid-connected mode in line with micro-grid model parameters used in [65,66]. Tables 4 and 5 give the values for K_p and T_p respectively, as well as the values for D and H_{eq} determined from:

$$D = \frac{1}{K_p}, \quad (4)$$

$$H_{eq} = \frac{T_p \cdot D}{2}. \quad (5)$$

As can be seen, there are severe differences among the values considered in each study to simulate the equivalent power system model, which affect considerably the corresponding frequency excursions in terms of nadir and rate of change of frequency (RoCoF) [67]. In fact, there is a relevant heterogeneity regarding equivalent power system inertia values, which can be derived from the different synchronous power plants connected to the grid in each study – refer to Eq. (1) –. This may be caused by the important differences existing among the inertia constant of power plants, mainly depending on their type and rated power as detailed in [19]. With regard to the damping factor, remarkable differences are found in the specific literature as well. Furthermore, it is crucial to estimate an accurate value of D for power systems under disturbances, as this parameter highly influences the results and, subsequently, can have a relevant impact on the study [68]. Frequency control of power systems for stability analysis are also sensitive to such parameter values. Moreover, virtual damping and virtual inertia based on the small-signal stability are currently topics of interest for the scientific community [69,70]. Nevertheless, such topics are out of the aim of this paper and they have been extensively discussed in other contributions [71–75].

3. Supply-side: Conventional thermal power plant modeling

In frequency stability studies, thermal power plants have been traditionally and still typically used by TSO for frequency control purposes [82]. As a usual term, thermal power plants mainly refer to those based on fossil fuels: coal, oil, and natural gas [83], which still represent an important share in current power systems. For instance, coal-fired power plants fueled 38% of global electricity in 2020 [84].

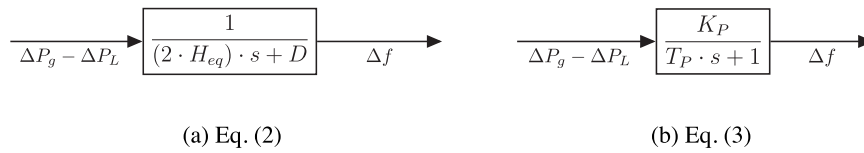


Fig. 2. Power system models for frequency stability studies simulations.

Table 2
Values of equivalent inertia constant (H_{eq}) for frequency analysis.

Constant	Value	Refs.	Year
H_{eq}	5	[76]	2004
H_{eq}	4–5	[28]	2010
H_{eq}	3.5	[77]	2012
H_{eq}	4–5	[29]	2012
H_{eq}	5	[78]	2013
H_{eq}	5–6	[45]	2013
H_{eq}	5–6	[51]	2017
H_{eq}	5	[60]	2017
H_{eq}	7.11	[34]	2017
H_{eq}	5	[79]	2017
H_{eq}	5–6	[36]	2017
H_{eq}	5	[37]	2017
H_{eq}	5	[42]	2019
H_{eq}	3–3.3	[80]	2020
H_{eq}	4	[81]	2020

Table 3
Values of equivalent damping factor (D) for frequency analysis.

Constant	Value	Refs.	Year
D	0.8	[76]	2004
D	0.6–0.9	[28]	2010
D	0.1	[30]	2012
D	0.6–0.9	[29]	2012
D	0.01	[78]	2013
D	0.0084–1.8	[45]	2013
D	1.5	[51]	2017
D	1–3	[37]	2017
D	0.01	[60]	2017
D	1–1.8	[36]	2017
D	0.8–1	[42]	2019

Table 4
Values of K_p and D ($1/K_p$) for frequency analysis.

Constant	Value	Constant	Value	Refs.	Year
K_p	120	D	0.0083	[55]	2012
K_p	115–120	D	0.0087–0.0083	[58]	2016
K_p	120	D	0.0083	[59]	2016
K_p	20–120	D	0.05–0.0083	[63]	2019
K_p	120	D	0.0083	[64]	2019

Table 5
Values of T_p and H_{eq} ($T_p \cdot D/2$) for frequency analysis.

Constant	Value	Constant	Value	Refs.	Year
T_p	10	H_{eq}	0.0417	[55]	2012
T_p	10–20	H_{eq}	0.0435–0.083	[58]	2016
T_p	20	H_{eq}	0.083	[59]	2016
T_p	3.76–20	H_{eq}	0.094–0.083	[63]	2019
T_p	20	H_{eq}	0.083	[64]	2019

3.1. Steam turbines

With regard to steam turbines, they have different turbine dimensions depending on the cycle pressures; i.e., high pressure, intermediate pressure, and low pressure. In current thermal power plants, the steam from the high pressure turbine goes back to the power plant to be reheated. It goes through the intermediate pressure turbine, and then it is conducted to the low pressure turbine by means of the cross-over pipe. The efficiency of the thermodynamic cycle is increased by

Table 6
Non-reheat steam turbine: parameters (Fig. 3(a)).

Parameter	Value	Refs.	Year
T_g	0.2–0.3	[28]	2010
T_g	0.2–0.3	[29]	2012
T_g	0.06–0.17	[45]	2013
T_g	0.1–0.4	[51]	2017
T_g	0.1–0.2	[36]	2017
T_g	0.08	[35]	2017
T_g	0.08	[40]	2019
T_g	0.1–0.4	[52]	2019
T_g	0.06–0.08	[54]	2020
T_{CH}	0.5–0.6	[28]	2010
T_{CH}	0.5–0.6	[29]	2012
T_{CH}	0.3–0.4	[45]	2013
T_{CH}	0.17–0.3	[51]	2017
T_{CH}	0.3–0.4	[36]	2017
T_{CH}	0.4	[35]	2017
T_{CH}	0.4	[40]	2019
T_{CH}	0.17–0.3	[52]	2019
T_{CH}	0.3–0.4	[54]	2020

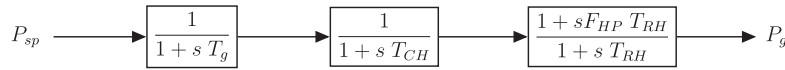
Table 7
Single-reheat steam turbine: parameters (Fig. 3(b)).

Parameter	Value	Refs.	Year
T_g	0.08	[30]	2012
T_g	0.20	[55]	2012
T_g	0.078–0.082	[58]	2016
T_g	0.08	[59]	2016
T_g	0.20	[80]	2020
T_{CH}	0.30	[30]	2012
T_{CH}	0.30	[55]	2012
T_{CH}	0.30–0.70	[58]	2016
T_{CH}	0.30	[59]	2016
T_{CH}	0.30	[80]	2020
T_{RH}	10	[30]	2012
T_{RH}	10	[55]	2012
T_{RH}	4–4.30	[58]	2016
T_{RH}	10	[59]	2016
T_{RH}	7	[80]	2020
F_{HP}	0.50	[30]	2012
F_{HP}	0.33	[55]	2012
F_{HP}	0.31–0.34	[58]	2016
F_{HP}	0.50	[59]	2016
F_{HP}	0.30	[80]	2020

reheating the steam [85]. In the literature review, steam turbines for frequency analysis are usually modeled by two different approaches: non-reheat steam turbines [28,29,35,36,51–54,59,63,64] and single-reheat steam turbines [30,31,38,39,42,55,57–64,81]. Both approaches include the governor, modeled as a first-order transfer function ($1/(1 + s T_g)$), as summarized in Fig. 3. In these block diagrams, P_{sp} [W] is the set-point power, T_g [s] is the time constant of the governor, T_{CH} [s] is the time constant of the steam chest and the inlet piping, T_{RH} [s] is the time constant of the re-heater, F_{HP} [–] is the fraction of total turbine power generated by the HP body of the turbine, and P_g [W] is the generated power. Typical values of these parameters are given in Table 6 for non-reheat steam turbine, and in Table 7 for single-reheat steam turbine.



(a) None-reheat steam turbine



(b) Single reheat steam turbine

Fig. 3. Steam turbine models used in frequency control simulations.



Fig. 4. Gas turbine model.

3.2. Gas turbines

Gas turbines use gas as working fluid, i.e. air, carbon dioxide, or helium [85]. Among the different studies found in the specific literature focused on gas turbines modeling, two main models are identified to give explicitly simulations of such turbines: (i) the non-reheat steam turbine modeling depicted in Fig. 3(a) [86,87], being $T_g = 0.1$ s and $T_{CH} = 0.4$ s; and (ii) the model provided in Fig. 4, by considering a valve positioner, speed governor, fuel system and combustor, and the gas turbine. As can be seen in Fig. 4, a [-] and c [-] are the valve positioner constants, b [s] is the valve positioner time constant, X [s] is the lead time constant of the gas turbine speed governor, Y [s] is the lag time constant of the gas turbine speed governor, T_F [s] is the gas turbine fuel time constant, T_{CR} [s] is the gas turbine combustion reaction time delay, and T_{CD} [s] is the compressor discharge volume time constant [88–90]. These references used the same values for the different parameters: $a = 1$, $b = 0.05$ s, $c = 1$, $X = 0.6$ s, $Y = 1$ s, $T_F = 0.23$ s, $T_{CR} = 0.01$ s, and $T_{CD} = 0.20$ s.

3.3. Combined cycle gas turbine

In reference to combined cycle gas turbine (CCGT) plants, it is the result of combining a steam turbine and a gas turbine, each one powering its own generator. As a consequence, a higher efficiency is obtained compared to a conventional thermal plant [85]. CCGT plants are commonly considered for frequency stability studies through the Rowen CCGT model [37,60,61,78,91–93]. Fig. 5 schematically represents such a model. Further information of the parameter values and ranges can be found in [78]. According to Hermans et al. [94], the fast capabilities of CCGT are essential in power systems with high integration of variable Renewable Energy Sources (vRES), as these grids need a more flexible operation, as already detailed in Section 1.

3.4. Nuclear power plants

Due to the high fixed costs and low variable costs of nuclear power plants, and together with security reasons, these generation units usually work as base-load power plants [95,96]. Possible power output variations can then occur under the needs of the plant operator, instead of under the needs of the system operator [97]. Consequently, nuclear power plants do not usually participate in frequency control strategies, subsequently not being considered in most frequency stability studies. In fact, some works which include nuclear power plants in their supply-side, consider its output power as a constant [98–101], thus not modeling the power plant. However, as some national power systems have a large amount of their supply-side from nuclear power plants

(e.g., Belgium (50%), Hungary (50%), Ukraine (50%), and France (75%), [102]), advanced nuclear reactors have been currently designed to provide a suitable transient response capability [103]. Moreover, Li et al. [104] affirm that, with the increase of the nuclear power share-generation in the world, it is an inexorable trend that nuclear power units will participate in the load-follow operation of future grids.

As nuclear units are based on steam turbines [105], the reheat-steam turbine of Fig. 3(b) can be used as a first approximation to simulate such power plants. However, to the authors' knowledge, no studies focused on load-frequency control included such a model and, consequently, no parameters can be provided. In contrast, based on the model presented in [106], two recent studies provided a linear model to simulate nuclear power plants [107,108], see Fig. 6: T_g [s] is speed governor time constant, T_{T1} [s] is the time constant of LP turbine, T_{RH1} [s] is the time constant of first LP turbine, T_{RH2} [s] is the time constant of second LP turbine; $A = K_{H1} \cdot T_{RH2} + K_{H1} \cdot T_{RH1} + K_{R1} \cdot T_{RH2}$ [s], and $B = K_{H1} \cdot T_{RH1} \cdot T_{RH2}$ [s²], being K_{H1} [-] the gain of HP turbine, and K_{R1} [-] the gain of the LP turbine. The values used in the simulations for the different parameters were: $K_{H1} = 2$; $K_{R1} = 0.3$; $T_{T1} = 0.5$ s; $T_{RH1} = 7$ s; $T_{RH2} = 9$ s.

4. Supply-side: Renewable energy sources modeling

Different and diverse sources are considered as renewable, such as hydropower, wind (onshore and offshore), solar (PV and thermal), biomass, geothermal, and ocean (tide and wave). Among them, hydropower, wind, and PV installations are the most mature technologies to be integrated into power systems [109–111] and their equivalent power plant models are following reviewed in this section.

4.1. Hydro-power plants

Hydro-power plants are commonly modeled and included for frequency analysis in a remarkable amount of works [38,39,42,63,64, 80,81,112–115]. The traditional equivalent modeling of these turbines assumes the following issues [21]: (i) the hydraulic resistance is negligible; (ii) the penstock pipe is inelastic, being thus incompressible water; (iii) water speed varies directly with the gate opening and the square root of the net head; and (iv) the turbine output power is proportional to the product of the head and volume flow. Under these premises, the hydro-power turbine transfer function is shown in Fig. 7, being P_{sp} the set-point power, T_g the time constant of the governor, T_R the reset time, R_T the temporary droop, R_P the permanent droop, and T_w the water starting time estimated as follows:

$$T_w = \frac{L \cdot U_0}{a_g \cdot H_0}, \quad (6)$$

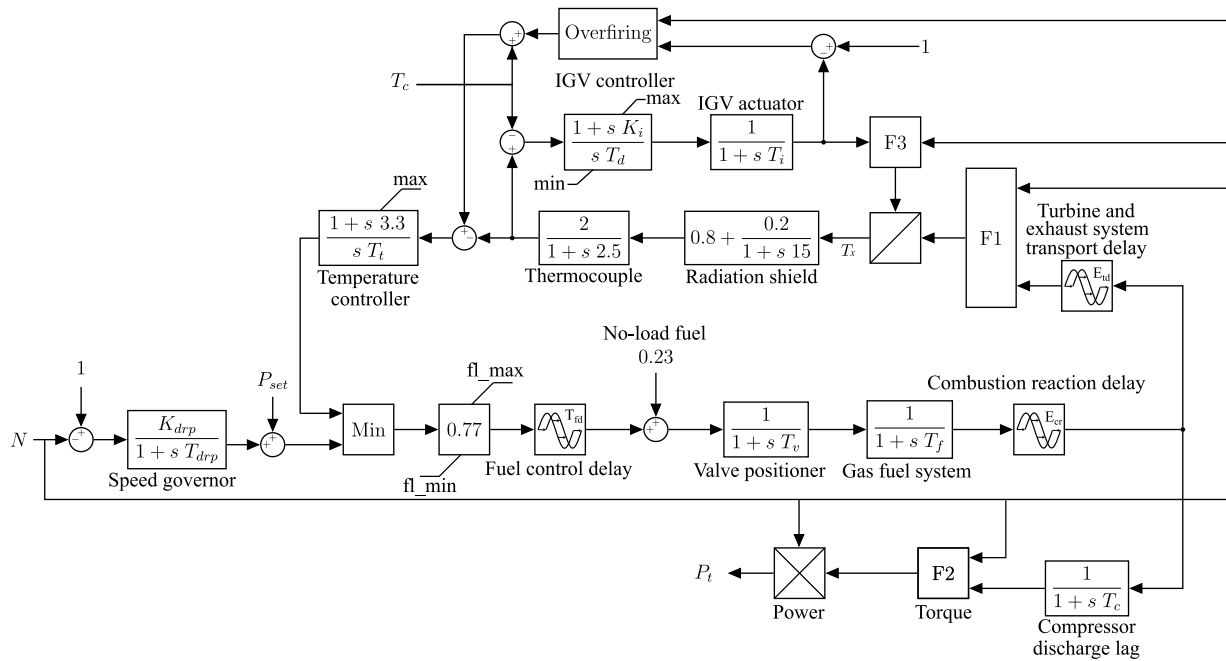


Fig. 5. Rowen CCGT model.

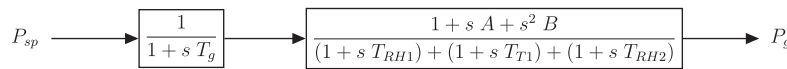


Fig. 6. Linear nuclear power plant model.

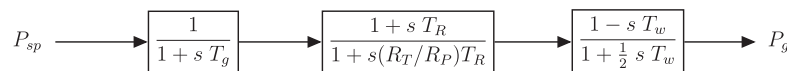


Fig. 7. Classical hydro-power turbine modeling.

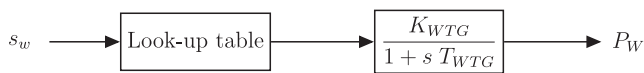


Fig. 8. Simplified equivalent model for a wind turbine.

where H_0 is the initial steady-state of the hydraulic head at gate, U_0 is the initial steady-state of the water velocity, a_g is the constant of gravity and L is the length of conduit. Both R_T and T_R can be determined from:

$$R_T = [2.3 - (T_w - 1) \cdot 0.15] \cdot \frac{T_w}{2 \cdot H}, \quad (7)$$

$$T_R = [5 - (T_w - 1) \cdot 0.5] \cdot T_w, \quad (8)$$

being H the inertia constant of the hydro-power plant [21,116]. Typical values of these parameters are given in Table 8. As can be seen, the same (or quite similar) values are given for the classical hydro-power plant model. Nevertheless, some authors consider that this model is not applicable for hydro-power plants including long penstocks. In such cases, the elasticity of water and conduit should be included and modeled as presented in [117–119]. However, according to Eremia et al. [85], the simplified model of Fig. 7 is suitable for control system studies, such as frequency stability analysis.

4.2. Wind power plants

The frequency control based on wind power plants has become an important subject during the last decade [120]. In addition, the

Table 8
Hydro-power plant modeling: parameters (see Fig. 7).

Parameters	Value	Refs.	Year
T_w	0.5–4	[21]	1994
T_w	1	[38]	2018
T_w	1	[42]	2019
T_w	1	[63]	2019
T_w	1	[80]	2020
T_R	5	[21]	1994
T_R	5	[38]	2018
T_R	5	[42]	2019
T_R	5	[63]	2019
T_R	5	[80]	2020
R_T	0.38	[21]	1994
R_T	0.38	[38]	2018
R_T	0.38	[80]	2020
R_P	0.05	[21]	1994
R_P	0.05	[38]	2018
R_P	0.05	[80]	2020
T_s	0.2	[21]	1994
T_s	0.2	[38]	2018
T_s	0.6	[63]	2019
T_s	0.2	[42]	2019
T_s	0.2	[80]	2020
R_T/R_P	7.6	[42]	2019
R_T/R_P	6.4	[63]	2019

wind turbine generator design has an influence on the control mechanism [121,122], being variable wind speed turbine (VWST) the most

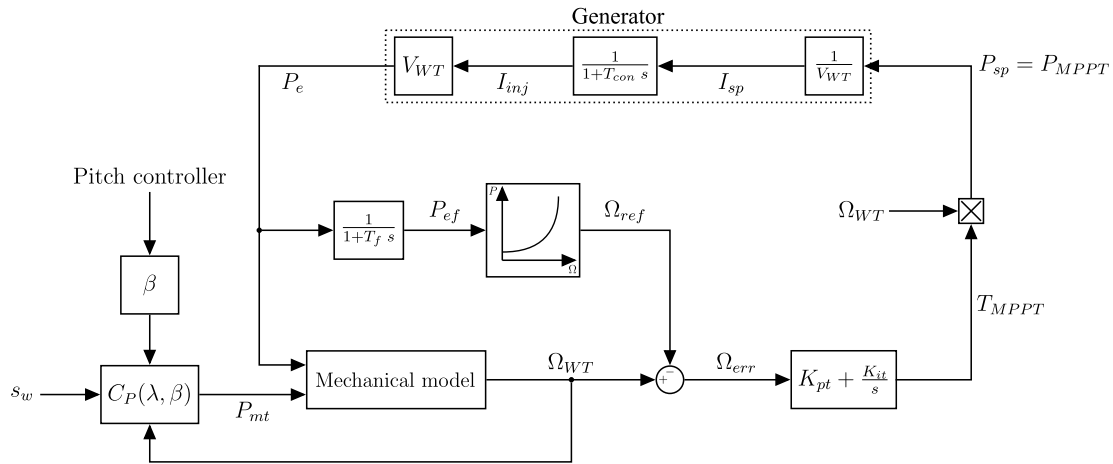


Fig. 9. Equivalent wind turbine model for frequency control strategies.

Table 9
Simple model for wind turbines: parameters (Fig. 8).

Parameters	Value	Refs.	Year
K_{WTG}	1	[79]	2017
K_{WTG}	1	[132]	2018
K_{WTG}	1	[54]	2020
T_{WTG}	1.5 s	[79]	2017
T_{WTG}	0.2 s	[132]	2018
T_{WTG}	1.5 s	[54]	2020

common design and which allows to implement different frequency control strategies or techniques [123–125]. However, these generation units do not sense any grid frequency drop as they are connected to the grid through converters [126], even though wind turbines have similar inertia to conventional generators due to the stored kinetic energy in their rotating masses [127]. Different equivalent wind power plant models have been proposed in the specific literature to provide and evaluate grid frequency stability with high vRES integration [128]. Indeed, some contributions affirm that aggregated and simplified models simulating wind power plants provide similar results for power analysis. In this way, Chang-Chien *et al.* [129] compared wind power plant participation in automatic generation control by (i) aggregating individual wind turbines, and (ii) assuming a simplified equivalent wind power plant model. Fernández *et al.* [130] modeled wind power plants based on aggregating detailed models of wind turbines, and compared to an equivalent wind turbine for power system dynamic simulations. Conroy *et al.* [131] compared one equivalent wind turbine generator with a re-scaled power capacity to each wind turbine generator modeled separately for transient stability studies.

As a first simplified wind turbine model, different authors have proposed a first-order transfer function [54,79,132] – see Fig. 8 –. Parameters of this model are summarized in Table 9. Nevertheless, the most common model used to simulate an equivalent wind turbine for frequency studies is shown and described in Fig. 9. Regarding the mechanical model, it can either be a one-mass [38–40,115,118,133–138] or two-mass [135,136,138–141] model, see Fig. 10. The two-mass model assumes the rotor and blades as a single mass, and the generator as another mass [23,142,143]. However, most studies analyze frequency deviations with the one-mass mechanical model, assuming it as acceptable due to the consideration of constant voltage [144]. On the contrary, Huerta *et al.* considers that the two-mass model is the most suitable to evaluate grid stability [145]. In addition to the mechanical model, two main equations estimate the C_p curves from β and λ parameters:

$$C_p(\lambda, \beta) = c_1 \cdot \left(\frac{c_2}{\lambda_i} - c_3 \beta - c_4 \right) e^{\frac{-c_5}{\lambda_i}} + c_6 \lambda_i. \quad (9)$$

This expression is considered in [33,62,77,81,124,134,140,141,146–149], where c_1 to c_6 values are the wind turbine characteristic coefficients and λ_i is estimated with:

$$\frac{1}{\lambda_i} = \frac{1}{\lambda - 0.08 \beta} - \frac{0.035}{\beta^3 + 1}. \quad (10)$$

On the other hand, the following expression is taken into account in [23,38,39,46,118,133,150,151]:

$$C_p(\lambda, \beta) = \sum_{i=0}^4 \sum_{j=0}^4 \alpha_{i,j} \cdot \beta^i \cdot \lambda^j, \quad (11)$$

being $\alpha_{i,j}$ specific coefficients depending on each specific wind turbine. This expression is proposed in [152,153] to model some General Electric wind turbines for grid studies.

4.3. PV power plants

A PV module is represented by its mathematical characteristic I–V function because of its accuracy and simplicity [154–160]:

$$I_{pv} = N_p \cdot I_{ph} - N_p \cdot I_{rs} \left(e^{\frac{q \cdot V_{MPP}}{k \cdot T \cdot A \cdot N_s}} - 1 \right), \quad (12)$$

where N_p is the number of cells in parallel, N_s is the number of cells in series, I_{rs} is the reverse saturation current, q is the electron charge ($1.6 \cdot 10^{-19}$ C), k is the Boltzmann’s constant ($1.4 \cdot 10^{-23}$ J/K), A is the ideality factor, T is the temperature, and V_{MPP} is the voltage at maximum power point. I_{ph} is the short-circuit current for one string of the PV panel, which can be estimated with

$$I_{ph} = [I_{sc} + K_I(T - T_{ref})] \cdot S, \quad (13)$$

being I_{sc} the short-circuit current of the cell, T_{ref} the reference temperature, and K_I the temperature coefficient.

This V_{MPP} for a given irradiation E is calculated based on $V_{MPP,STC}$ (voltage at maximum power point at standard test conditions), which is specified in the data sheet of the PV module. Moreover, V_{MPP} also varies with temperature. A correction factor α_v is thus included. The V_{MPP} is then calculated for any irradiation and temperature with:

$$V_{MPP} = V_{MPP,STC} \cdot \left(\frac{\ln(E)}{\ln(1000)} \right) \cdot [1 + \alpha_v(T - T_{STC})]. \quad (14)$$

By multiplying I_{pv} by V_{MPP} (results of Eq. (12) and (14)), the power of the PV module is obtained. In most studies, the PV system is simply modeled by a first-order transfer function to analyze the frequency stability of the power system [161], neglecting any dynamic behavior of the PV power conversion systems [162–166] (see Fig. 11).

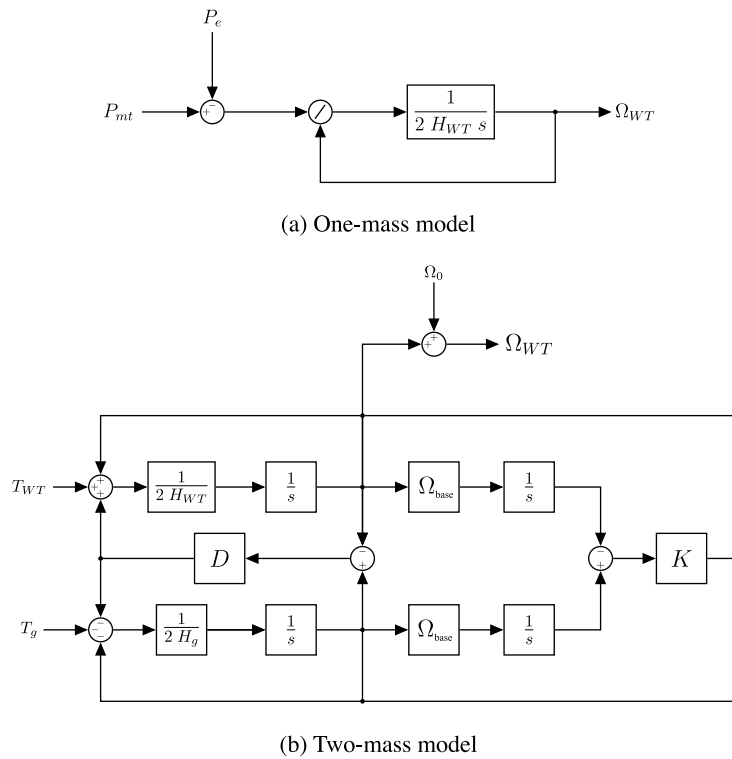


Fig. 10. Mechanical models for VSWTs.

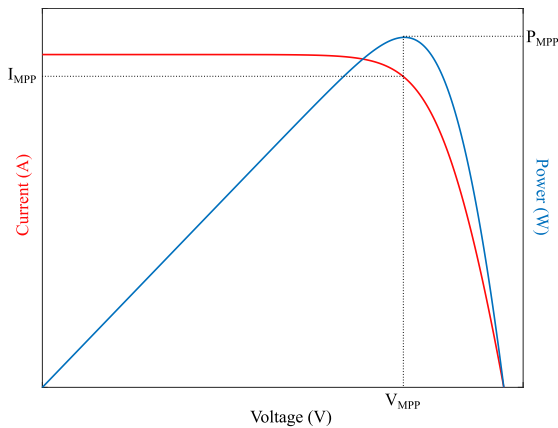


Fig. 11. I-V and P-V curves of a PV module.

4.4. Emerging renewable technologies

Biomass power plants are based on a conventional Rankine thermodynamic power cycle [105]. These power plants include a boiler, a steam turbine, and a condenser [167–170]. As a result, the models presented in Fig. 3 for steam turbines are used to simulate biomass power plants in frequency studies with the parameters shown in Table 10 [132,171,172].

Concentrated-solar power plants (CSPP) are based on heating a working fluid through concentrated sunlight. This heated fluid is then used with conventional turbines and generators to produce electricity [174]. Indeed, the solar heat from the field can be integrated into the three power conversion cycles of Section 3 [175]. However, they are commonly based on steam turbines [105]. Actually, in recent years, several studies focused on frequency control have included CSPP by using the non-reheat steam turbine shown in Fig. 3(a) [176–182]. The

Table 10 Values of steam turbine model parameters for biomass power plants.

Constant	Value	Refs.	Year
T_g	0.2 s	[173]	2003
T_s	0.08 s	[171]	2018
T_{CH}	0.55 s	[173]	2003
T_{CH}	0.3 s	[171]	2018
T_{RH}	10 s	[171]	2018
F_{HP}	0.3	[171]	2018

Table 11 Values of non-reheat steam turbine parameters for CSPP.

Parameter	Value	Refs.	Year
T_g	1 s	[176]	2015
T_s	1 s	[181]	2018
T_{CH}	3 s	[176]	2015
T_{CH}	5 s	[79]	2017
T_{CH}	3 s	[181]	2018

parameters used in this case are presented in Table 11. Rahman et al. [79] did not consider the governor transfer function.

Finally, and apart from the aforementioned vRES, biomass, and CSPP, there are other renewable sources, such as geothermal energy and ocean energy (tide and wave) [183]. However, and due to the low penetration of these sources and their weak integration, they are not considered in this study.

5. Simulation results

In order to understand the influence of the different values for the same parameter, some simulations are here carried out. Only those linear models which have severe differences between the values proposed in the specific literature are considered (i.e., Figs. 2, 3, 7 and 8). The values are changed between the minimum and the maximum of those

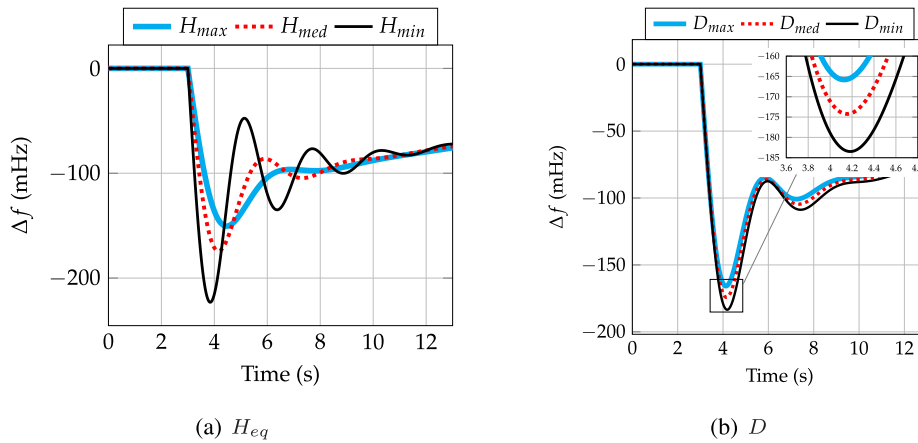


Fig. 12. Δf depending on the values of the power system.

Table 12

Values considered for comparing frequency stability.

Type	Figure	Parameter	Minimum	Maximum	Mean
Power system	2(a)	H_{eq}	3.00	7.11	5.06
		D	0.01	1.80	0.90
Non-reheat steam turbine	3(a)	T_g	0.06	0.40	0.23
		T_{CH}	0.17	0.60	0.39
Reheat steam turbine	3(b)	T_g	0.08	0.20	0.14
		T_{CH}	0.30	0.70	0.50
		T_{RH}	4.00	10.00	7.00
		F_{HP}	0.30	0.50	0.40
Hydro-power	7	T_g	0.20	0.60	0.40
		T_w	0.50	4.00	2.25
		T_R	-	-	5.00
		R_T	-	-	0.38
		R_p	-	-	0.05
Wind	8	K_{WTG}	-	-	1.00
		T_{WTG}	0.20	1.50	0.85

shown in previous tables, and the mean of them. Table 12 presents the specific values considered. In such cases where only one value is provided for a parameter, it is shown in the **Mean** column. To clearly show how the values affect the frequency stability, each parameter under analysis is changed at a time, considering the others as fixed and equal to the **Mean** values. A sudden increase of the consumed power is supposed at $t = 5$ s, with a value of $\Delta P = 0.05$ pu. This power imbalance is not considered for the wind turbine model, but a variable wind speed profile, as depicted in Fig. 16(a). Together with this, the primary and secondary frequency controls are included for thermal and hydropower plants, considering $R_{thermal} = R_{hydro} = 0.05$ for the primary frequency control, and an integral constant of $K_{I,thermal} = K_{I,hydro} = 1$. The results for the different simulations are shown in Figs. 12–16.

As can be seen, the reduction of the inertia H_{eq} causes an increase in the frequency deviation values and oscillations. This is in line with previous studies, as already explained in Section 1, and one of the main drawbacks of massive integration of vRES. Indeed, severe frequency variations can occur if proper controllers are not included in such units and vRES replace conventional power plants. With regard to the damping factor D , the lower its value the larger the frequency excursions, but its impact is much more reduced than H_{eq} (see Fig. 12). With regard to the non-reheat steam turbine model, both T_g and T_{CH} get lower and less oscillating frequency deviations when their values are reduced. In fact, both of them have nearly the same effects on frequency deviations, as their values are quite similar (refer to Table 12). Similar results are gotten for the reheat steam turbine (Fig. 14): T_g , T_{CH} , and T_{RH} reduce the Δf as they reduce their values, being T_{CH} the one that affects the most; however, the lower the value of

F_{HP} , the larger the frequency excursion. The T_g value of hydropower plants slightly affects the frequency variation, whereas reducing the T_w constant reduces the Δf deviation as well (Fig. 15). Finally, as the value of T_{wtg} is reduced, the frequency excursions are increased (see Fig. 16). In summary, the analyzed parameters have a relevant influence on the frequency excursions and power system performance under imbalance conditions. Subsequently, standard benchmark models should be proposed by the researchers and the international committees for frequency control analysis, avoiding discrepancies in terms of simulation conditions, modeling and parameters.

6. Discussion

Apart from the different supply-side models presented in Sections 3 and 4, there are other elements, techniques, and power plants that can be considered in frequency deviation studies, which, in fact, can reduce the frequency excursions under high vRES integration [184]. With regard to energy storage systems (ESS), different solutions have been proposed in the literature to be applied to power systems with high RES integration, mainly batteries, super-capacitors, and flywheels. Nevertheless, these ESS require capital investment, being crucial to estimate the reasonable storage capacities avoiding any overflow size [185]. Among them, batteries are considered as the oldest and most mature storage system [186] and, according to Akram et al. [187], those based on lithium-ion are the ones that best suits for frequency regulation services. As super-capacitors have higher levels of power with lower energy storage ratio in contrast to batteries [188–190], several proposals have been made to combine batteries and super-capacitors [191], being considered as an interesting solution to solve the ‘intermittency’ of vRES [192]; in fact, according to Bai et al. [193], such combination is a proper alternative to improve the battery lifetime and enhance the system economy. Flywheels are applied from very small microsattellites to large power systems [194]. Amiryar and Pullen [195] concluded that flywheels are excellent options to back up solar PV.

Together with this, new types of hybrid power plants can deal with the power variations due to the high vRES integration. In fact, the pumped storage hydropower plants are commonly under study [196–199]. In fact, several advantages are obtained in contrast to other ESS, such as the huge amount of energy that can be stored in the reservoirs, the high energy conversion efficiency, and the flexibility provided in the short-term [200]. This kind of hybrid power plant helps on balancing the energy production and consumption by pumping water (increasing the load) at valley hours and generating electricity (increasing the generation) at peak hours, to balance energy production and consumption levels [201].

Hydrogen is the most abundant element on the Earth, accounting for, approximately, 15 mol% of its surface [202]. Nowadays, the

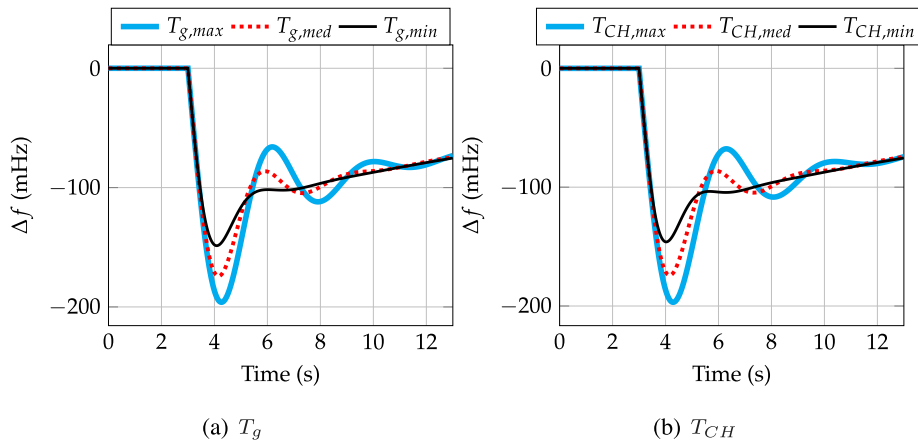


Fig. 13. Δf depending on the values of the non-reheat steam turbine.

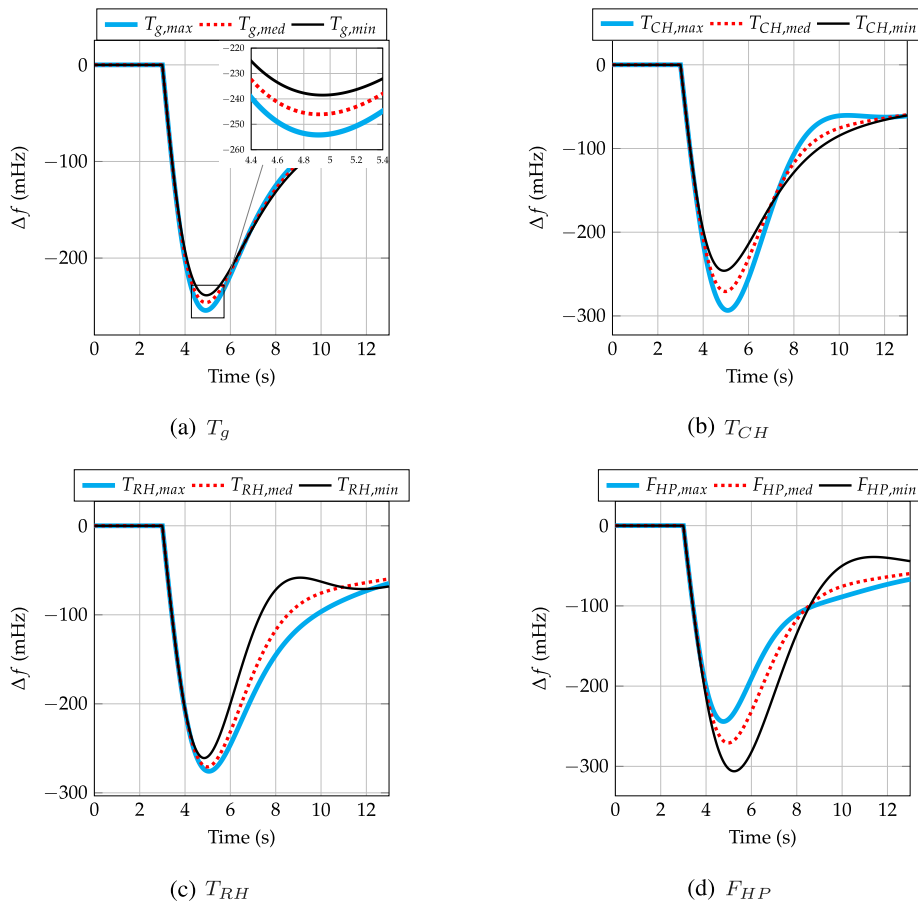


Fig. 14. Δf depending on the values of the reheat steam turbine.

'number-one element' is considered as the future energy carrier [203]. In fact, according to Mazloomi and Gomes [204], hydrogen can not only be a feasible energy carrier, but also an energy source at consumer level. Moreover, recent studies affirm that it can be produced from the different RES, such as solar and wind energies, water electrolysis, and biomass [205,206]. Among the different benefits of hydrogen, its main application from the power system stability point of view is the power-to-gas (P2G) conversion. P2G implies using the excess of generated renewable electricity to produce hydrogen via water electrolysis [207,208]. Hence, the system's flexibility would be enhanced [209], as these P2G plants would provide supply security in terms of storage facilities [210].

Finally, demand response participation in frequency control has gained important developments in recent years. A review of design and control schemes for electrical load contribution can be found in [211], focused on frequency control algorithms. Secondary frequency control based on demand response was developed by Lakshmanan et al. [212]. Control strategies for including battery energy storage systems (BESSs) and demand response for load frequency control strategies are recently proposed in [213–215]. Coordinated electric vehicles (dis)charging and demand response participating in frequency control have been also discussed in the specific literature [216–218]. In general, the contributions demonstrate the effectiveness of the coordinated and hybrid

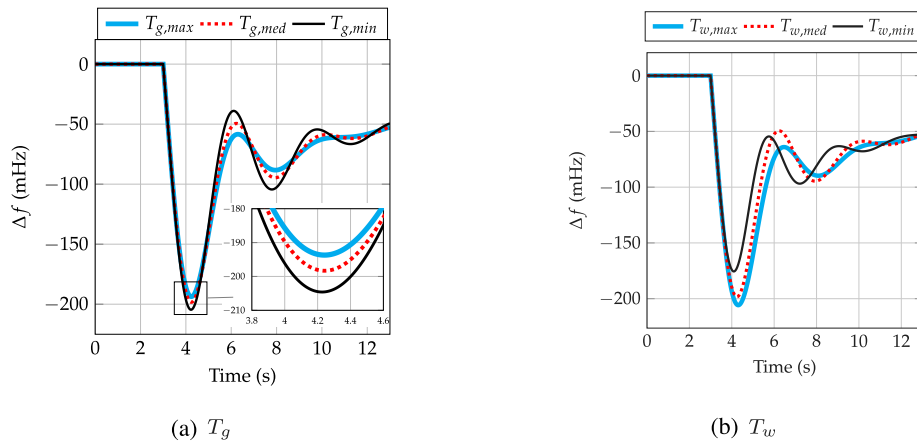


Fig. 15. Δf depending on the values of the hydropower plant.

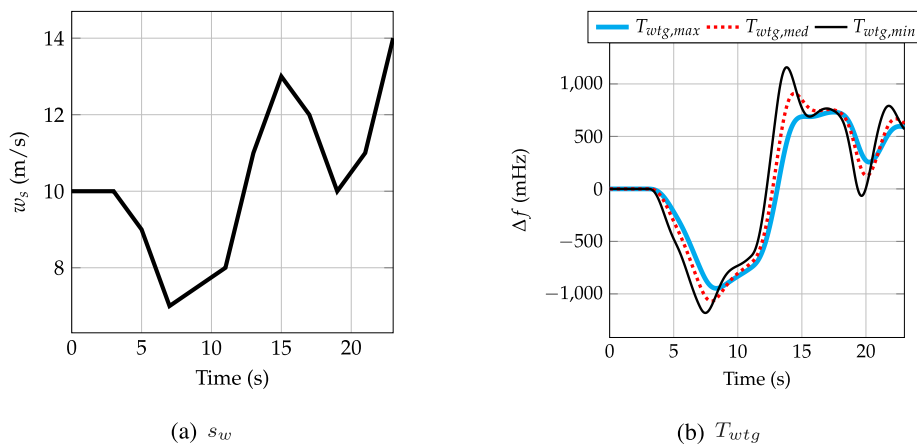


Fig. 16. Δf depending on the values of the wind turbine generator.

algorithms, aimed to provide interactive solutions based on aggregated agents: demand response, energy storage and electric vehicles [219].

7. Conclusion

In this paper, an extensive literature review focused on supply-side and power system modeling for frequency control analysis is discussed in detail. The parameters involved in the swing equation (grid inertia and damping factor) are summarized and compared when used to simulate power systems. Moreover, the models for conventional generation units (steam turbines, gas turbines, combined cycle gas turbines, and nuclear power plants) and renewable generation units (mainly hydropower, wind and PV) are provided. The parameters used for each model are widely discussed and compared, with more than 50 different values identified and referenced. From this literature review, consensual models for the power system and the different generation units should be proposed, aiming to homogenize the frequency stability analysis that would allow the scientific community to evaluate future frequency control strategies under similar/equivalent assumptions, which is not currently available in the specific literature.

Declaration of competing interest

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

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