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Assessing the Economic Benefits of Compressed Air Energy Storage for Mitigating Wind Curtailment

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Assessing the Economic Benefits of Compressed Air Energy Storage for Mitigating Wind Curtailment

Brendan Cleary, *Student Member, IEEE*, Aidan Duffy, Alan O'Connor, Michael Conlon, *Member, IEEE* , and Vasilis Fthenakis 3₄ Brendan Cleary, *Student Member, IEEE*, Aidan Duf
⁴ and Vasili
⁵ *Abstract*—**Renewable energy generation in the All-Island of**

 Ireland (AII) is set to increase by 2020 due to binding renew- able energy targets. To achieve these targets, there will be periods of time when 75% of electricity will be generated mainly from onshore wind. Currently, the AII system can accommodate a 50% maximum permissible instantaneous level of wind generation. The system operators must make system-wide wind curtailment deci- sions to ensure that this level is not breached. Subsequently, the ability to limit wind curtailment using large-scale energy storage such as pumped hydroelectric energy storage and compressed air energy storage (CAES) is increasingly being scrutinized as a viable option. Thus, the aims of this paper are to estimate the level of wind curtailment on the 2020 AII system for various scenarios including with and without CAES, and assess and quantify the rev- enue loss due to wind curtailment using power systems simulation software PLEXOS.

 *Index Terms—***Compressed air energy storage (CAES), energy markets, PLEXOS, power system economics, power system model- ing, power system operation, revenue, total generation costs, wind curtailment, wind power.**

- 25 AII All-Island of Ireland.
- 26 CAES Compressed air energy storage.
- 27 MSQ Market schedule quantities.
- 28 RES Renewable energy sources.
- 29 SMP System marginal prices.
- 30 SNSP System nonsynchronous penetration.

31 **I. INTRODUCTION**

T HE TRANSITION to RES, namely wind and solar, has progressed rapidly as countries strive to meet binding progressed rapidly as countries strive to meet binding renewable energy targets. In 2012, wind power provided 2.5% of global electricity demand and up to 30% in Denmark, 20%

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in Portugal, and 14.5% in Ireland [1]. This higher provision in 36 European countries is driven by the European Commission's 37 framework that put in place in 2009, built around 2020 tar- 38 gets for renewable energy (20%), greenhouse gas emission 39 reduction (20%) , and energy efficiency (20%) [2]. 40

In particular, the governments of the Republic of Ireland 41 (ROI) and Northern Ireland (NI) have set an ambitious target 42 that requires 40% of electricity to come from RES, predomi- 43 nately wind, by 2020 [3]. The current and proposed 2020 level 44 of installed wind capacity across the AII^1 is, and will continue 45 to be, one of the highest global levels relative to the size of the 46 system [4]. The transmission system operators (TSOs) Eirgrid 47 and SONI are seeking to operate between 5000 and 6000 MW 48 of wind capacity across the AII by 2020 [5]. This represents 49 circa 37%–41% of the total generation capacity in 2020. 50

The increasing amount of wind capacity due for connection 51 introduces a new challenge for the TSOs in maintaining the 52 stability of the system. Currently, the AII system can accom- 53 modate a 50% maximum permissible instantaneous level of 54 nonsynchronous generation such as wind. As a consequence, 55 the TSOs must make system-wide curtailment decisions, par- 56 ticularly in the case of wind generation to ensure that this level 57 is not breached. 58

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the nately wind, by 2020 [3]. The current and proposed 2020 level
of installed vind capacity serons the AII is, and wil Since 2003, curtailment has been highlighted by the Irish 59 wind energy sector as a potential limiting factor to the long- 60 term growth of wind farm development in Ireland. In the 61 meantime, policy makers have taken limited action to effec- 62 tively address this issue and enact mitigating measures. In 2011, 63 curtailment levels for all wind farms across the AII averaged 64 2% with some wind farms experiencing no curtailment while 65 others had levels of 7%–8% [6]. It should be noted, however, 66 that during this year, outages on the Moyle interconnector (MI) 67 between NI and Scotland and the only pumped storage plant 68 in the AII resulted in higher levels of curtailment than would 69 otherwise have been expected [7]. $\frac{70}{20}$

More recently, the Single Electricity Market (SEM) 71 Committee for the AII has been considering matters associ- 72 ated with curtailment in tie-break situations. The committee 73 decided that operational wind farms (both firm and nonfirm) 74 will be turned down on an equal basis in a curtailment situation 75 from March 1, 2013. Furthermore, compensation payments for 76 curtailment will cease on the January 1, 2018, and the TSOs 77 and SEM operator will be responsible for implementing this 78 through the relevant grid code and market structure, respec- 79 tively $[8]$. 80

¹The ROI and NI are two separate jurisdictions with a common synchronous power system known as the All-Island of Ireland (AII).

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 Subsequently, the decision to remove compensation for curtailment by 2018 will be of major concern to investors in the wind energy sector. It is, therefore, essential that ongoing work including: Eirgrid's DS3 and Grid 25 pro- grams are delivered on time in order to minimize the occur- rences of curtailment. These programs involve developing financial incentives for enhanced plant performance, opera- tional policies, system tools, and additional grid infrastructure development.

 Large-scale energy storage such as pumped hydroelectric energy storage (PHES) and CAES also allows curtailed wind energy to be stored until it is required [9]. Currently, only one 292 MW PHES plant exists in the AII and has been operational since 1974. However, despite PHES being considered a mature technology, further development in the AII has ceased mainly due to the lack of suitable sites, high initial capital costs, and environmental impact concerns.

 Apart from PHES, CAES is the only commercial large-scale storage technology to have been deployed at utility scale, and a number of research projects have analyzed CAES as a solution to improving wind integration and reducing wind curtailment [10]–[12]. An appraisal of the geological conditions and the potential of underground gas storage and CAES deployment were undertaken in Larne, NI [13]. Results indicated that Larne is the only place in NI and one of the few places in the AII, which has salt deposits potentially suitable for CAES [13], [14]. Hence, the potential exists for a 268-MW CAES plant to be connected to the AII system [14].

 In summary, CAES can reduce wind curtailment and improve the long-term growth of wind farm development in the AII. Thus, the aims of the paper are 1) to estimate the level of wind curtailment on the 2020 AII system for various scenarios including with and without CAES and 2) to assess and quantify the revenue loss to wind generation due to the termination of wind curtailment compensation.

116 **II. COMPRESSED AIR ENERGY STORAGE**

117 *A. Overview of Technology*

 CAES is a hybrid form of storage and is a modification of the conventional gas turbine (GT) technology. A CAES plant consists of a power train motor used to drive a compressor to compress air into a reservoir, a high- and low-pressure tur- bine, and a generator. The reservoir is either an aboveground vessel/pipe or an underground geologic formation such as salt, rock, and saline aquifers.

 A CAES plant operates similarly to a conventional GT with the compression and expansion stages occurring independently or concurrently depending on the plant type. During the com- pression stage, excess electricity or off peak low cost electricity is used to run a chain of compressors which injects air into the reservoir.

 During the expansion stage, when electricity is required, pressurized air is released from the reservoir and used to run a turbine which produces electricity. In order to improve the power output of the turbine, natural gas is used in the

combustion cycle. This allows electricity to be generated using 135 only 33% of the natural gas required to generate the same 136 amount of electricity as a conventional GT [15]. 137

CAES plant designs are categorized based on the method 138 of managing heat from compression and expansion of the air. 139 These categories are diabatic, adiabatic, and isothermal. In 140 diabatic CAES (often referred to as "conventional" or "first 141 generation" CAES), the heat of compression is removed and 142 dissipated during compression and the air is reheated during 143 expansion [16]. Second-generation CAES is similar to first gen- 144 eration except a modified design that leads to improved com- 145 pression and/or expansion stages using air injection techniques 146 to increase efficiency. 147

In adiabatic CAES (referred to as "third-generation" CAES), 148 the heat of compression is stored in a solid or fluid and returned 149 to the air during expansion [16]. Therefore, no natural gas is 150 required to heat the compressed air in the combustion cham- 151 ber. Similarly, in an advanced adiabatic (AA) CAES plant, 152 the waste heat is captured and rereleased into the compressed 153 air, so that no gas co-combustion to heat the compressed air 154 is required. The key benefits of adiabatic and AA CAES are 155 higher efficiencies and reduced carbon emissions as there is no 156 fuel consumption required during generation. 157

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and proposed In Isothermal CAES, the compression and expansion stages 158 are conducted in a slow manner to ensure that the air is main- 159 tained at an approximate constant temperature through heat 160 exchanges with the environment [16]. The theoretical efficiency 161 of isothermal CAES approaches 100% for perfect heat transfer 162 to the environment. However, in practice, perfect thermody- 163 namic cycles are not obtainable as some heat loss occurs. In 164 conclusion, both AA and isothermal CAES are still at the 165 research and development stage and it could be sometime 166 before large-scale deployment occurs. 167

B. Review of Developments 168

CAES is more than 40 years old, dating from the 1970s when 169 it was first deployed as a means of providing energy during 170 peak demand and bridging supply shortfalls from slow ramping 171 base load plants [17]. At present, there are two first-generation 172 diabatic CAES plants in operation, one in Huntorf, Germany 173 where a 290-MW plant was constructed in 1978 and another in 174 Alabama, USA where a 110-MW plant was constructed in 1991 175 [10]. They were mainly built for their black start capabilities 176 and peak shaving services. 177

Some pilot CAES plants have been built in Japan and Italy 178 (25 MW) and are proposed for Israel and Russia. In the United 179 States (U.S.), construction of a diabatic 317-MW CAES plant 180 near Tennessee Colony, Texas is due to commence in Spring 181 2015 [18]. Moreover, it will be the first CAES plant to be built 182 in the U.S. since the plant in Alabama. 183

In Europe, the idea of developing CAES is obtaining momen- 184 tum due to the deployment of intermittent wind and solar power 185 plants. In particular, the TSOs in the ROI and NI are in dis- 186 cussion with an energy company about the connection of the 187 proposed 268 MW CAES plant in the Larne area, NI [19]. This 188 plant has been listed as a one of the projects of community 189

190 interest within the European Union and is envisaged to be listed 191 as critical infrastructure under the SEM [20].

 The European Commission has supported the first AA CAES plant due for construction in Germany by 2016, entitled the "ADELE" project [21]. The aim of this project is to further advance the necessary components for this technology and to develop the basic concept for the first AA CAES plant.

 The world's first 1.5 MW Isothermal CAES plant is located at SustainX headquarters in Seabrook, New Hampshire, USA [22]. The process involves capturing the heat produced dur- ing compression, trapping it in water, and storing the warmed air–water mixture in pipes. When electricity is required by the grid, the isothermal expansion delivers electricity with no requirement for natural gas combustion.

204 III. METHODOLOGY

205 *A. Modeling Software*

 The main proprietary modeling software used in differ- ent countries for power systems modeling include EMCAS, PLEXOS, EnergyPLAN, WASP IV, and WILMAR [23]. The most common modeling software used for AII system modeling are WILMAR and PLEXOS. The WILMAR planning tool was first issued in 2006 and was originally used to study wind vari- ability in the Nord pool system. It was then modified to analyze the Irish system as part of the All-Island Grid Study [24].

 PLEXOS is an integrated energy software tool developed by Energy Exemplar and is used for power and gas market mod- eling worldwide [25]. Since 2007, PLEXOS has been used in Ireland by the TSOs, Commission for Energy Regulation (CER), and SEM participants to validate and forecast SEM out- comes [26], [27]. Moreover, it is considered by academia as a well-proved tool for policy analysis and development in the AII [11], [28]–[31]. Therefore, PLEXOS version 6.208 R04 was used to build and run the models for the analysis presented in this paper.

224 *B. Base Model Verification and Validation*

 The CER provides publically accessible calibrated backcast and validated forecast PLEXOS models annually [27]. The CER uses these models to monitor gaming by simulating the SMP and market outcomes in the SEM.

 In this study, the CER 2010 backcast model is used to replicate the actual ex-post SMP and MSQ observed in the SEM. The PLEXOS modeling configuration, which provided the best replication of the ex-post data across the simulation horizon, was then used to inform any recommendations for the 2011–2012 validated forecast model.

 The CER 2010 backcast model was run for 365 days at 30 min intraday trading periods. The technical and commercial characteristics for each generator participating in the SEM were defined by submitted technical and commercial offer data [27]. This consists mainly of no load costs, start costs and start cost times, actual availabilities, min up/down times, and minimum stable level (MSL). This represented the exact data submitted by the generators to the SEM operator, which was verified by 243 the CER.

A comparative validation analysis was conducted between 244 the backcast model outputs and the actual market outputs. The 245 mean absolute percentage errors (MAPE) were 6.1% and 7.7% 246 for average daily SMP and annual MSQ, respectively. The 247 backcast model produces a profile for the average daily SMP, 248 which is consistent with the actual market. It was noticeable 249 that there were regular price spikes and dips for the on-peak and 250 off-peak hours, respectively. Also, it generally produces higher 251 off-peak SMP than the actual market, whereas on-peak prices 252 are lower than observed in the actual market. 253

The discrepancies between the SMP and the MSQs can be 254 attributed to PLEXOS's tendency to over-schedule generators, 255 which reduces the shadow price but increases the uplift by a 256 similar amount. The shadow price makes up most of the SMP 257 and relates to the incremental short run marginal cost bids 258 from generators comprising of fuel and carbon costs. The uplift 259 component covers the generator's start-up and no-load costs. 260 Therefore, there are some instances where higher uplift was 261 caused by the cost recovery method in PLEXOS for generators 262 that only ever ran at MSL during the year. This effect was also 263 observed in previous validation studies, and it is recommended 264 that MSL and ramp rate uplift filters be kept on [27] and [32]. 265

C. 2020 Model Description 266

DOLOGY

component covers the generator's start-up and no-load costs

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caused by the cost recovery method in PLEXOS for generator

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A main constraint restricting the amount of nonsynchronous 277 generation, mainly wind, on the AII system is enforced in the 278 model. This is known as the SNSP limit and is a measure of 279 the nonsynchronous generation on the AII system at an instant 280 in time as shown by (1) [33]. Based on extensive research by 281 the TSOs on high wind penetration levels, an SNSP limit was 282 identified as an all-encompassing indicator for the operational 283 ranges allowing secure operation of the AII system [33] 284

$$
\frac{\text{Wind generation} + \text{imports}}{\text{System demand} + \text{exports}} \leq \text{SNSP} \tag{1}
$$

where the SNSP limit ensures that the amount of wind gen- 285 eration, when added to interconnector imports, does not exceed 286 the sum of system demand and interconnector exports. The sys- 287 tem demand includes the pump storage and CAES consumption 288 when in pumping mode. 289

The PLEXOS simulation engine reads the input data such 290 as system demand and wind data as shown in Fig. 1. It simu- 291 lates 366 individual daily optimizations at half-hourly intervals 292 ensuring that the generation portfolio meets demand at least 293 cost while taking into account the generator's techno-economic 294 parameters. Generator and system-wide constraints are also 295 enforced for each simulation period. Similar to the SEM, the 296

F1:1 Fig. 1. PLEXOS system modeling structure.

297 solver calculates SMP and MSQ for each period; therefore, pro-

298 viding an accurate representation of the dispatch of generators

299 in the AII system.

300 *D. Model Scenarios*

 Table I shows the scenarios simulated in this analysis. Two main operational scenarios: 1) business as usual (BAU) and 2) enhanced operational capability (EOC) have been considered with the remaining two scenarios containing a CAES plant as an additional generator.

306 A description of each scenario is as follows.

 1) BAU represents the current operational network con- straints with a 50% SNSP limit and an installed wind capacity of 3600 MW. The interconnector flows are set as a fixed input based on the outputs from a market unconstrained model run for this analysis. This approach replicates the current SEM rules, whereby interconnec- tor nominations are determined by the ex-ante market dispatch schedule. Operating reserve requirements are assigned to each generator based on current operational policy. Hence, this scenario is considered to represent a realistic real time operation of the system.

- 318 2) EOC is the BAU scenario with a 75% SNSP limit instead 319 of 50% and an installed wind capacity of 5211 MW 320 was assumed to achieve the required 37% of electricity 321 from wind by 2020. It represents the possible opera-322 tional network constraints if enhanced system services are 323 implemented by 2020.
- 324 3) BAU + CAES is the BAU scenario with a CAES plant 325 included in the AII generation portfolio. The CAES 326 plant only contributes to energy requirements in this 327 scenario.

GE₁

²BAU and BAU+CAES scenarios. ³EOC and EOC+CAES scenarios.

4) $EOC + CAES$ is the EOC scenario with a CAES plant 328 included in the AII generation portfolio. In this sce- 329 nario, the CAES plant contributes to energy and operat- 330 ing reserve requirements, which are explained in more 331 detailed in Sections III-E and III-F. 332

E. Main Model Assumptions 333

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 The AII system demand is expected to increase 12% between 334 2011 and 2020 based on the median demand forecast by Eirgrid 335 [5]. The median demand forecast is considered to reflect the lat- 336 est projections for the AII based on the future economic climate 337 and has been used for several AII case studies. The annual sys- 338 tem median demand is estimated to be 41.2 TWh with a peak 339 demand of 7.3 GW. Accordingly, the 2011 demand time series 340 profile is linearly scaled to reflect the 2020 median demand 341 forecast. 342

A breakdown of the generator types used for the scenarios 343 simulated in this analysis is shown in Table II. 344

Onshore wind capacity varies for each scenario and it is 345 assumed that no more offshore wind will be developed in 346 the AII prior to 2020. It is assumed that only 25 MW of 347 installed offshore wind capacity exists from a single wind farm 348 at Arklow Bank, Co., Wicklow, Ireland. 349

Wind generation is modeled under the assumption of perfect 350 foresight in aggregated form, split into 13 regions. The capacity 351 for each region is based on the proposed regional distribution of 352 renewable capacity by Eirgrid [34]. Each region has an associ- 353 ated half-hourly profile, which represents the wind availability 354 in that region in each half hour as a percentage of total installed 355 capacity in that region. These profiles were developed from 356 historical time series data from 2011. 357

 $T2:2$

 The general approach is to model wind generation with zero short run marginal costs (fuel, carbon, and start costs equal zero) based on the assumption that it will always run when available, due to its priority dispatch status. Similarly, pre- dictable price takers peat, wave, waste, and CHP generators are assigned zero short run marginal cost to ensure that they are dispatched fully when available.

 Modeling the GB system is required in order to determine the interconnector flows between SEM and GB. Gas generation has been the predominant marginal plant type on the GB sys- tem and a high correlation between the cost of gas generation and the GB electricity price has been determined [27]. A single gas generator of 2000 MW with multiband heat rates, variable operating and maintenance (VOM) costs, and 1100 MW of load was, therefore, used to represent the GB system.

 The CER also adopts this simplified GB representation to determine SEM outcomes. GB wind is not modeled and signifi- cant data collection is required to create a complete GB system. Moreover, including the complete GB system in each scenario would significantly increase the computational time and so the approach described is applied.

 The complete transmission network is not included in the model and localized network constraints are not modeled. Instead, the model consists of system-wide constraints and three separate nodes representing the ROI, NI, and GB sys- tems. It is assumed that adequate transmission capacity as per Eirgrid's Grid 25 program has been built by 2020 to accommodate increased levels of wind capacity on the system. There is a restricted flow of 450 MW in the NI–ROI and 400 MW ROI–NI directions at present due to system security issues. However, the full rating of the north–south transmission line between NI and ROI is assumed to be in place by 2020; therefore, flows of 1500 MW both ways are set within the model [35].

 The MI links NI to Scotland, and flows on the MI are largely driven by arbitrage of the relative prices in the two systems. The MI is limited to exporting 300 MW and importing 450 MW November–March and 410 MW April–October. However, there is uncertainty in relation to the actual maximum import and export capacity of the MI for the foreseeable future due to an undersea cable fault [19]. The east–west (EW) interconnector between the ROI and GB nodes, maximum flow was assumed 500 MW both ways.

 The model applies historic transmission loss adjustment fac- tors to all generators to account for the possible losses within the AII system. Planned and unplanned maintenance for each generator during the year is considered. The former is assigned manually based on the 2011 schedule and the latter is modeled as a random event.

 The number of high inertia generators required online for system stability is applied as per the 2013 Transmission Constraint Groups (TCGs) requirements [36]. There are also constraints applied on certain groups of generators and maxi- mum export capacities within certain regions. Including these constraints within the model allows for a more realistic real time system operation.

414 The reserve requirements for 2020 are set based on modified 415 TCGs requirements to take account of the increased amount of

TABLE III T3:1 OPERATING RESERVE REQUIREMENTS **T3:2**

wind generation on the AII system. Three categories of operat- 416 ing reserve were modeled: 1) primary operating reserve (POR), 417 2) secondary operating reserve (SOR), and 3) two classes of 418 tertiary operating reserve (TOR1 and TOR2). It is assumed that 419 the reserve categories will remain unchanged as a result of the 420 TSOs DS3 program to refine the system services products [26]. 421

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increase the beat membed and interest and the restricted and the restrictions of the constrained and the constrained in the constrained in the c For each reserve category, there is a total requirement and a 422 minimum dynamic requirement. The total requirement ranges 423 between 75% and 100% of the largest electricity in-feed 424 depending on the reserve category [36]. This was based on 425 an assumed largest in-feed of 500 MW, corresponding to the 426 largest generator on the AII system, which is the EW intercon- 427 nector. The minimum requirement for each reserve category is 428 fixed at 165 MW. The total requirement as a percentage of the 429 largest in-feed and minimum dynamic requirement is outlined 430 in Table III. 431

Certain generators are assigned reserve capacities for each 432 reserve category for the provision of dynamic reserve. Static 433 reserve provision of 35 MW of interruptible load is assumed 434 to be provided from the PHES plant during pumping mode for 435 static reserve [37], [38]. The MI and EW interconnectors are 436 assumed to hold 75 and 50 MW of static reserve, respectively. 437

In summary, this analysis employs a deterministic model 438 using a set of main assumptions based on published data. The 439 analysis assumes perfect foresight for wind generation and sys- 440 tem demand with no significant rules changes to the SEM or to 441 the broader market by 2020. The analysis, therefore, applies the 442 current SEM rules and assumes the current bidding principles 443 and methodology for calculating the various cost and revenue 444 streams remain unchanged. 445

F. Modeling of Storage 446

A simplified modeling approach for the PHES plant is 447 adopted for the market unconstrained model. PHES is modeled 448 as four separate units similar to hydro units, which are allowed 449 to run from a zero level up to maximum capacity. In the pump 450 mode, the units are also allowed to pump from a zero level up 451 to maximum pump capacity. During the simulations, PHES is 452 forced to refill to a predefined target by the end of each day. 453 This approach was used previously for PHES modeling in the 454 SEM [39]. 455

However, the real-time operation of the PHES plant is rather 456 different. For all scenarios, the PHES has three distinct modes: 457 1) spin, 2) min, and 3) pump. In spin mode, each unit can 458 provide 5 MW but no more than two units can be in spin mode 459

T4:1 TABLE IV T4:2 CAES PLANT TECHNICAL OPERATING DETAILS [41]

Parameters	Value	Units
Maximum compression	200	MW
Minimum compression	60	MW
Ramp rate for compression	40	MW/min
Maximum generation	270	MW
Minimum generation	67.5	MW
Ramp rate for generation	54	MW/min
CAES heat rate	4.265	GJ/MWh
CAES storage capacity	3	GWh
Compressing efficiency	80	$\%$
Part load energy ratio (kWh _{in} /kWh _{out})	0.83	

 at any one time with the remaining two units providing a min- imum generation level of 35 MW. In min mode, each unit can provide between 40 and 73 MW, which contributes to both POR and SOR. The PHES units share a common penstock; therefore, a constraint to prevent concurrent generation and pumping is set within the model. In the final mode, pump mode, the PHES four fixed speed pump units can each draw a load of 71.5 MW from the AII grid and can provide full capacity for POR. Again, these three operational modes were adopted previously for real-time PHES modeling in the AII system [30].

 A CAES plant is represented within the model by a PHES plant coupled with a GT plant using constraints to replicate the operation of the CAES plant. In compression mode, the PHES plant draws power from the grid to compress air; whereas, in generation mode, both the PHES plant and GT generate power. A constraint limiting the combined output of the PHES plant and GT plant is set based on the maximum generation capacity of the CAES plant. This approximation of the CAES plant con- figuration was used previously for other case studies [11], [40]. The details of the CAES plant used for this analysis are shown in Table IV and are assumed to represent the plant, which will be connected to the AII power system in 2020.

 At present, it is unclear which reserve categories the CAES plant will contribute toward for the AII system. Therefore, the CAES plant's reserve capabilities are based around the con- tributions in which the existing open-cycle GTs and PHES provide for generation and pumping in the AII system, respec- tively. The contribution of the CAES plant to generation and pumping reserve capabilities is assumed as 30 and 100 MW for each reserve category (POR, SOR, TOR1, and TOR2), respectively.

491 *G. Cost Data*

 Fuel prices are based on predictions for 2020 from two main 493 sources [42], [43]. A carbon tax of ϵ 30/t CO₂ based on the European Union emissions trading scheme was applied to fos- sil fuel burning generators. This was a realistic figure based on the carbon taxes used for previous AII case studies, which 497 ranged between ϵ 15/t and ϵ 45/t CO₂ [28], [42], [44]–[46]. Generator VOM costs were obtained from several sources [45]– [47] and start costs were derived from historic start costs [27]. Cost data for the CAES plant were based on Thorner *et al.* [41]. All cost data were normalized to 2012 values using consumer price indices [48].

Fig. 2. System wide wind curtailment levels. F2:1

IV. RESULTS AND DISCUSSION 503

A. System-Wide Wind Curtailment 504

The main result from this analysis is an estimate of the 505 system-wide wind curtailment levels in the 2020 AII system for 506 various scenarios including with and without CAES. The cur- 507 rent AII system can accommodate a maximum SNSP limit of 508 50%; however, if mitigation measures are introduced, an oper- 509 ational limit of 75% SNSP is possible. The impact that this 510 increase has on the system for different scenarios is shown in 511 Fig. 2. 512

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the Wind Curatatiment

draw a load of 71.5 MW from

example at the Sixtern-Wid The wind curtailment levels are reduced due to the addition 513 of the CAES plant in the $BAU + CAES$ and $EOC + CAES$. . 514 The difference between the EOC and the $EOC + CAES$ wind 515 curtailment levels are 1.2%. For instance, when a curtailment 516 event occurs in the $EOC + CAES$ scenario, for each 100 MW 517 of increased demand created by the CAES plant in compres- 518 sion mode, it allows 75 MW of wind to remain connected 519 and increases the synchronous generation by 25 MW to sat- 520 isfy the SNSP limit. Similarly, for the $BAU + CAES$ scenario, 521 CAES allows 50 MW of wind to remain connected to the AII 522 system. 523

B. Economic Assessment 524

A comparison of the wind generation revenue loss as a result 525 of wind curtailment is presented in Table V. The pool rev- 526 enue (product of price received in ϵ /MWh and generation in 527 MWh) is the revenue collected by each generator in the SEM. 528 Therefore, the revenue loss is a product of average annual price 529 received and the amount of wind curtailed for each scenario. 530

The revenue loss decreases substantially as a result of 531 increasing the SNSP limit to 75%. The addition of the CAES 532 plant further decreases the revenue loss and in turn increases 533 the revenue for wind generation by ϵ 10 million for the EOC + 534 CAES scenario. Wind curtailment levels above 5% have been 535 suggested to have significant economic risk for the long-term 536 growth of wind farm development in Ireland [35]. Moreover, 537 compensation payments for wind curtailment will cease on the 538 January 1, 2018. Therefore, the results suggest that increasing 539

REVENUE LOSS COMPARISON

F3:1 Fig. 3. Total generation costs for each scenario.

T5:1 TABLE V

T5:2

540 the SNSP limit to 75% and utilizing a CAES plant mitigates 541 wind curtailment and reduces the economic risk.

 Furthermore, due to the addition of the CAES plant, the pool revenues for most of the other generator types increased. This is mainly due to an increase in the average annual SMP from ϵ 65/MWh to ϵ 68.5/MWh for the EOC and EOC + CAES scenarios, respectively. This is beneficial for some of the gener- ators as they are paid a higher price from the pool but this has a knock-on effect to the electricity consumer.

549 The overall economic benefit of moving from 50% to 75% SNSP limit and the inclusion of the CAES plant can be quanti- fied by comparing the total generation costs for the AII system. Fig. 3 presents the total generation costs (including VOM cost, fuel cost, start and shutdown costs, and emissions costs) for

 each scenario over the year 2020. The higher SNSP limit and the inclusion of the CAES plant leads to lower total annual generation costs. The CAES plant's benefit to the system results in a reduction in costs of 3.3% com-558 pared to the EOC scenario. This equates to ϵ 50 million over the year 2020. This reduction cannot be attributed to a single event but occurs as minor cumulative changes over the year. From a technical perspective, this reduction is due to the CAES plant's ability to provide additional flexibility to the AII system.

563 Moreover, based on a capital cost of ϵ 0.6 million/MW for 564 the CAES plant and annual savings of ϵ 50 million, the pay- back period is less than 4 years for the AII system. However, the payback period would differ for a private investor and a detailed cost-benefit analysis would determine whether it is a viable technology.

V. CONCLUSION 569

The economic benefits of CAES to wind generation were 570 evaluated using the power systems and market modeling soft- 571 ware PLEXOS. Based on the modeling conducted, it was 572 determined that a 270-MW CAES plant in conjunction with a 573 75% SNSP limit can reduce wind curtailment levels to 2.6% in 574 2020. 575

It was also shown that the addition of CAES increases the 576 revenue for wind generation by ϵ 10 million for the EOC + 577 CAES scenario. This is beneficial to the wind farm developers, 578 as it reduces their economic risk and encourages development. 579 Furthermore, CAES can contribute to the AII system other than 580 avoidance of wind curtailment. For instance, it can reduce total 581 annual generation costs by 3.3% relative to the proposed 2020 582 EOC scenario. These benefits are external to a private financial 583 assessment of a CAES project but should be considered in an 584 overall cost-benefit analysis. 585

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