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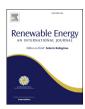
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# Simulating current-energy converters: SNL-EFDC model development, verification, and parameter estimation

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#### ABSTRACT

Increasing interest in power production from ocean, tidal, and river currents has led to significant efforts to maximize energy conversion through optimal design and siting and to minimize effects on the environment. Turbine-based, current-energy-converter (CEC) technologies remove energy from current-driven systems and in the process generate distinct wakes, which can interact with other CEC devices and can alter flow regimes, sediment dynamics, and water quality. This work introduces Sandia National Laboratories-Environmental Fluid Dynamics Code CEC module and verifies it against a two-dimensional analytical solution for power generation and hydrodynamic response of flow through a CEC tidal fence. With a two-dimensional model that accurately reflects an analytical solution, the effort was extended to three-dimensional models of three different laboratory-flume experiments that measured the impacts of CEC devices on flow. Both flow and turbulence model parameters were then calibrated against wake characteristics and turbulence measurements. This is the first time that turbulence parameter values have been specified for CEC devices. Measurements and simulations compare favorably and demonstrate the utility and accuracy of this numerical approach for simulating the impacts of CEC devices on the flow field. The model can be extended to future siting and analyses of CEC arrays in complex domains.

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# 1. Introduction

Current-energy converters (CECs) are a family of marine renewable-energy devices that harvest electrical power from water currents, such as those in river and tidal systems, to generate electricity. These devices hold promise as a non-consumable, domestic energy source; however, research is needed to make their cost of electricity competitive with other energy sources and to understand commensurate hydrodynamic and environmental effects [1]. System changes will be site-specific, necessitating an approach that can simulate various CEC technologies placed within any relevant marine or riverine system to predictively assess both hydrodynamic and environmental changes. Such an approach would be able to address questions about individual deployments and inform the decisions of regulatory agencies, opinions of

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stakeholder groups, and commitments from energy-project developers and investors [2].

While deploying a single test device is unlikely to significantly alter the flow and environment in any significant way, commercial arrays must be analyzed to ensure environmental thresholds are not exceeded. An analytical solution has been derived for a tidal strait that indicates a limit to the number of CEC devices that can be added to a system before the commensurate flow reduction yields less total energy generated [3,4]. At this transition point, the flow rate has been reduced by over 40%. More detailed modeling tools are required to investigate wake persistence and turbulent loadings from upstream devices that may necessitate broader array spacing to maximize performance and reliability. Hasegawa, Sheng, Greenberg and Thompson [5] performed a modeling study of the potential impact of CEC arrays on the Bay of Fundy and Gulf of Maine, which demonstrated that effects were not restricted to the immediate vicinity of the array. Tidal elevations were altered up to a few percent along a large portion of the coast outside of the Gulf. Due to the unique wetting and drying cycle of near-shore shallows,

http://dx.doi.org/10.1016/j.renene.2017.07.020 0960-1481/© 2017 Elsevier Ltd. All rights reserved. the health of adjacent wetlands could be impacted [6]. The flow, sediment-dynamics, and water-quality simulator, Delft3D [7], has been used to model energy extraction from tidal flows [8-10]. Changes in bed shear and turbulence alter sediment dynamics affecting erosion/deposition regions [11-14]. A 2-D hydroenvironmental model DIVAST was used to study the coastal environment and velocities adjacent to a 2000-device CEC array [15]. While water levels were largely unchanged, there was an increase in suspended sediment and fecal bacteria within 15 km of the array. Through each of these investigations it is obvious that altering the water circulation patterns impacts flushing rates, affecting algaegrowth patterns and concentrations of nutrients and dissolved gases [16]. As none of these models represent a planned deployment, they provide a unique opportunity to investigate thresholds for array sizes and locations and their impact upon the environment. In addition, acoustic energy and electromagnetic waves emanating from CEC devices, and associated infrastructure, may further perturb wildlife behavior [2,17-20], but are not presently incorporated into any hydrodynamic modeling tools.

To help balance performance and environmental drivers there is a need to develop verified and validated simulation approaches capable of predicting power output along with any environmental changes from a CEC array. For these approaches to be beneficial for developers, this type of modeling must provide turnaround times for month-long simulations in a matter of hours, while facilitating investigation of regional-scale hydrodynamic and environmental effects, (i.e., on domains spanning tens to hundreds of kilometers). In response to this need, Sandia National Laboratories (SNL) has developed and implemented a new capability into an existing flow. sediment-dynamics, and water-quality code (EFDC [21,22], now SNL-EFDC [23]) to quantify and visualize the interaction and influence of CEC devices in arbitrary flow systems. In this study, the power production of the model is first verified through comparison to an analytical solution in a simplified, two dimensional tidal channel as a function of flow rate [4]. Three laboratory flume experiments are used to calibrate turbulence parameters for use in CEC-specific applications. It is anticipated that a single set of parameters may be usable for CEC simulations, as has been seen in simulations for flow through vegetative canopies [24] and wind turbines [25]. SNL-EFDC is an open-source tool that can determine the power generated and effects of CEC arrays on system circulation, sediment dynamics, and water quality, thereby providing a platform to understand their environmental impacts at regional scales.

#### 2. Methods

### 2.1. Modeling framework

SNL-EFDC is a modified version of US Environmental Protection Agency's Environmental Fluid Dynamics Code [21,22], coupled to both the US Army Corps of Engineers' water-quality code, CE-QUAL-ICM (Quality Integrated Compartment Model) [26,27], and the sediment-dynamics code, SEDZLJ [28,29]. EFDC was developed to study river-, estuary-, coastal-, and ocean-scale systems. It also includes routines for vegetative resistance and wetting and drying of wetlands regions. EFDC has recently been implemented in a parallel computing environment [30,31].

The hydrodynamic portion of EFDC solves the hydrostatic, freesurface Reynolds-averaged Navier Stokes (RANS) equations with Mellor-Yamada turbulence closure [32] as modified by Galperin, Kantha, Hassid and Rosati [33]. This is similar to the model of Blumberg and Mellor [34] except for the solution of the free surface, which is solved with a preconditioned conjugate gradient solver. EFDC uses a curvilinear-orthogonal grid with a sigma vertical coordinate system [21,22]. The number of sigma layers is fixed for each model and assigned a constant (often equal) fraction of the flow depth throughout the model domain, where the local thickness of each layer changes with the topology of the model domain and water depth. EFDC's time integration uses a second-order-accurate finite-difference scheme with an internal/external mode-splitting procedure to separate the internal shear (or baroclinic mode calculated across each sigma layer) from the external free-surface gravity wave (or barotropic mode calculated on the depth average). EFDC has been extensively applied, validated, and documented at numerous sites worldwide, including estuaries, wetlands, lakes, rivers, and coastal environments [35–38]. The model has also been validated against analytical solutions, laboratory experiments, and real flow systems [39,40].

This effort introduces and presents a new SNL-EFDC module that considers momentum (energy) removal from the flow system by CEC devices and the commensurate changes to the momentum balance and turbulent kinetic energy and its length scale (or dissipation rate) [41,42]. The CEC module provides a design approach capable of rapidly predicting hydrodynamic changes resulting from power production from field-scale CEC array configurations. This modeling approach is not intended to provide high-fidelity simulations of rotor hydrodynamics or detailed turbine wake structures. Once a desired array layout has been identified using SNL-EFDC, more detailed CFD simulations can be performed [43–45]. It is acknowledged that waves may impact CEC wakes [46,47], but these effects are not considered in this work because none of the flume experiments implemented waves.

#### 2.2. Current-energy converter simulation module

The CEC module simulates removal of energy by turbines based on device-specific performance metrics through a reduction in momentum in model cells where devices are situated. Corresponding changes to turbulent kinetic energy and turbulence length scale are implemented similarly to changes through a vegetative canopy [48], which has been successfully applied to the wind-energy community [25,49]. Density-normalized source/sink terms,  $S_Q$  (m<sup>4</sup>/s<sup>2</sup>),  $S_k$  (m<sup>5</sup>/s<sup>3</sup>), and  $S_\ell$  (m<sup>6</sup>/s<sup>3</sup>) represent the rate of momentum reduction, net change to turbulence intensity, and the increase in turbulence length scale, respectively, are [50]:

$$S_Q = \frac{1}{2}C_T'AU^2,\tag{1}$$

$$S_k = \frac{1}{2} C_T' A \left( \beta_p U^3 - \beta_d U k \right), \tag{2}$$

$$S_{\ell} = C_{\ell \Delta} \ell S_{\nu}, \tag{3}$$

where  $C_T(-)$  is the modified (see below) thrust coefficient (or a constant drag coefficient,  $C_D$ , for support structures), U(m/s) is the undisturbed, local, free-stream flow speed, and  $A(m^2)$  is the flow-facing area of the turbine blades/support structure.  $k(m^2/s^2)$  is the mean-flow kinetic energy, and  $\beta_P(-)$  is the fraction of k converted to wake-generated kinetic energy by drag, which accounts for the production of wake turbulence and represents the ratio of mean kinetic energy transferred directly into turbulence (not the shear-generated turbulence).  $\beta_d(-)$  accounts for k dissipation through conversion to kinetic energy of the turbine blades, or the short-circuiting of the turbulence cascade where energy transfers from large-scale turbulence to smaller scales. The turbulence length scale is  $\ell$  (m) and  $C_{\ell 4}(-)$  is a closure constant [51]. For vegetative canopies, Katul, Mahrt, Poggi and Sanz [24] suggest  $\beta_P = 1$ ,  $\beta_d = 1-5$ , and  $C_{\ell 4} = 0.9$ , while for wind turbines Réthoré, Sørensen

and Zahle [25] suggest  $\beta_p = 0.05$ ,  $\beta_d = 1.5$ , and  $C_{\ell 4} = 1.6$ . These values are not directly transferrable to CEC devices because of density and viscosity differences between the media, existence of the free surface, and effects of the device on downstream turbulence (e.g., the difference between horizontal- and vertical-axis turbines). Instead, these parameters can be calibrated to available data sets. The effects of affiliated support structures are similarly considered.

Two additional parameters,  $\alpha_{md}$  and  $K_v$ , must be specified when using surface-water flow models like EFDC, where  $\alpha_{md}$  describes horizontal momentum diffusion [52] and K<sub>v</sub> specifies vertical momentum diffusion in the system. Each serves to damp velocity gradients in the horizontal and vertical (e.g., the wake structure behind a CEC device). Specifically,  $\alpha_{md}$  is a multiplier on the horizontal stress tensor [22, Eqns. (55)–(57)] in the solution of the horizontal momentum conservation equations. It represents subgrid-scale turbulent mixing and also serves to smooth cell-tocell spatial oscillations in the numerical solution in proportion to the local horizontal strain rate [52]. As a rule of thumb, the Smagorinsky constant should scale with the inverse square root of cell size, where a reasonable approximation for EFDC modeling is about one-thousandth of the average cell area in square meters when cells exceed  $10 \times 10 \text{ m}^2$ . This generality does not apply to models with grid cells smaller than a square meter, as used in these flume models, and is therefore a calibrated parameter.  $K_v$  is the vertical turbulent eddy viscosity, which appears in the vertical diffusive term in the horizontal momentum and  $k-k\ell$  turbulence equations [22, Eqns. (2), (3), (13) and (14)]. These two parameter are commonly calibrated for every surface-water model [37].

Equations (1) and (2) require the undisturbed flow speed; however, the presence of the device alters the local flow field. The local velocity at the device can be used instead, but requires modification of the device-specific, velocity-dependent, thrust coefficient [53]:

$$C_{\rm T}' = 4 \frac{1 - \sqrt{1 - C_{\rm T}}}{1 + \sqrt{1 - C_{\rm T}}}. (4)$$

Momentum theory applied to a streamtube fully encompassing a horizontal-axis turbine does not allow for the wake to reenergize. The upper bound for  $C_T$  is equal to 1 when derived through momentum theory whereupon a zero velocity occurs in the wake and as  $C_T$  increases further the wake velocity reverses. The power generated by a turbine is proportional to the thrust and can be estimated using the modified thrust coefficient as:

$$P = \frac{1}{2}\rho A C_T' U_d^3,\tag{5}$$

where  $\rho$  (kg/m<sup>3</sup>) is the fluid density and  $U_{\rm d}$  is the local velocity at the device.

## 3. Verification of power production

## 3.1. Analytical solution for a tidal channel

A two-dimensional tidal channel with a CEC fence of increasing density (number of turbines per cell) was simulated with SNL-EFDC to estimate the power generated and the hydrodynamic response. The fence represents a uniform, porous obstruction to flow at a cross section of the channel and does not explicitly consider individual turbines or allow for flow acceleration around the fence and in two dimensions (single model layer) there can be no flow over or under the fence. This representation provides a means to verify the energy removed by any number of turbines in the model without

regard to the other parameters or wake re-energization. Garrett and Cummins [4] present an analytical solution to this problem describing the instantaneous power potential of tidal currents in channels:

$$P = \rho Q(g\zeta - \alpha Q|Q|), \tag{6}$$

where  $Q(m^3/s)$  is instantaneous flow rate,  $g(m/s^2)$  is gravity,  $\zeta(m)$  is the surface elevation difference between the two ends of the channel, and  $\alpha(1/m^4)$  is a measure of the channel friction and flow separation at the ends. For a specified tidal prism, a maximum undisturbed flow rate exists for the channel and the total power produced initially increases as CECs are added. However, the added turbines also increase a resistance to the flow, ultimately reducing the overall flow rate. These two competing trends dictate that maximum power production cannot occur when the flow rate is at its maximum. The analytical solution predicts maximum power generation when the CEC resistance reduces the flow rate to 57.7% of the maximum. The maximum average power that can be generated from a tidal-channel system is then [4]:

$$\overline{P}_{\text{max}} = \gamma \rho g a Q_{\text{max}}, \tag{7}$$

where  $\gamma$  (–) is a coefficient between 0.21 and 0.24 that incorporates the time average of a harmonic tidal range, bed friction, and separation at the channel ends, a (m) is the tidal amplitude between the ends of the channel, and  $Q_{\rm max}$  (m³/s) is the maximum flow rate through the channel when undisturbed. As recommended by Garrett and Cummins [4],  $\gamma$  was set equal to 0.22, allowing a 10% margin in power accuracy.

#### 3.2. Simulation description

Using the geometry and domain setup specified by Yang, Wang and Copping [54], a tidal channel was developed for SNL-EFDC, shown in Fig. 1 and colored by depth. The dimensions of the system are listed in Table 1 and the bottom roughness was set to 2 cm. A sinusoidal, M2 tidal forcing with a 1-m amplitude was applied on the open-ocean boundary to the west and drives the surface elevation difference between both ends of the channel. For simplicity, and to compare most directly to the results of Garrett and Cummins [4], the simulation was two-dimensional (a single layer in the vertical, which does not consider flow above or below the devices) with a fence of turbines spanning the entire width of the channel. Fig. 2 indicates the location of the CEC fence where the number of turbines was varied uniformly in each of the 20 cells across the channel. Turbine resistance is treated as a porous obstruction where the momentum sink considers the turbine size (10-m diameter) and thrust coefficient ( $C_T = 0.5$ ). Assuming frictionless side walls, turbulence and flow parameters  $\beta_p$ ,  $\beta_d$ ,  $C_{\ell 4}$ ,  $\alpha_{md}$ , and K<sub>v</sub> have no effect on the power, flow rate, or wake recovery in a two-dimensional model; only the momentum sink,  $S_0$ , drives the system's response.

## 3.3. Discussion

The model initially ran with a turbine density of zero to replicate the unobstructed channel. This resulted in a maximum flow speed of 2.64 m/s and a predicted maximum average flow power of 2.10 GW. Turbine density was then increased as the flow rate and power generation were recorded. Fig. 3 shows that the SNL-EFDC model closely replicates the analytical solution of normalized power production [4,54]. The predicted maximum power from SNL-EFDC was generated when the flow rate was 57.3% of its maximum. This corresponds to a maximum average flow power of

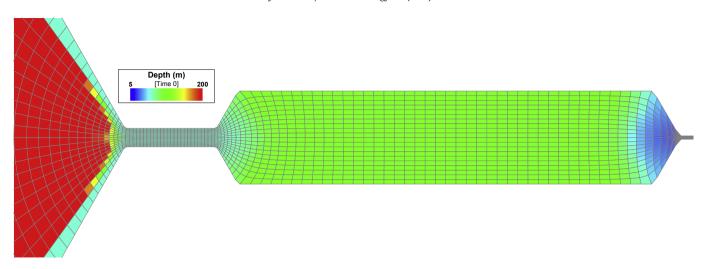


Fig. 1. Grid with depth (color) of the tidal channel. (For interpretation of the references to color in this figure legend, the reader is referred to the web version of this article.)

**Table 1** Tidal-channel dimensions.

Location	Length (m)	Width (m)	Depth (m)
Open ocean	165,000	260,000	200
Tidal channel	30,000	6000	60
Semi-enclosed bay	150,000	30,000	100

2.00 GW and an instantaneous maximum near 4.72 GW. The small difference between the analytical and model results can be accounted for by model approximations; the M2 tidal condition is enforced at one end of the domain instead of being a strict value across the channel,  $\gamma$  is held constant instead of being allowed to vary, and the single  $\sigma$  layer prevents any potential flow separation. Similar results were reported by Yang, Wang and Copping [54] with CEC modifications to their FVCOM model [55].

## 4. Turbulence parameter calibration

The tidal fence represents idealized energy removal in a tidal

straight and the two-dimensional approximation cannot account for the complex flow around and behind each device. Having verified that energy removed by CEC devices is accurately simulated, the k-k $\ell$  source equations, (2) and (3), become impactful in the following three-dimensional models and impact reenergization of the wake. Without their consideration, the wake would be overly persistent. Three experiments were used to calibrate those parameters for CEC-specific modeling.

#### 4.1. Experiment and simulation descriptions

The five adjustable model parameters were calibrated against three experimental data sets to investigate trends across the available experimental systems and data. The first data set is for an actuator-disc experiment conducted in the Chilworth flume at the University of Southampton in the UK [56]. Actuator discs have been shown to accurately represent the thrust load and wake deficit of horizontal-axis turbines [57], but are unable to induce the same vortical structure seen in both horizontal-axis and cross-flow turbines. The second and third sets of experimental data are from

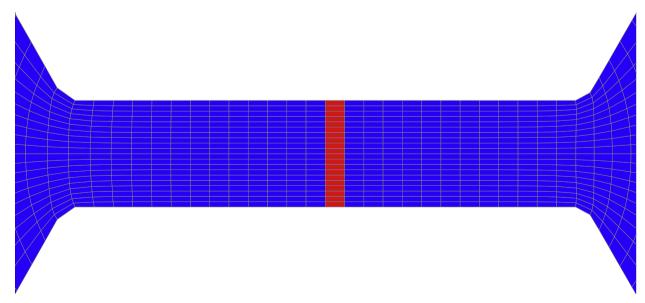
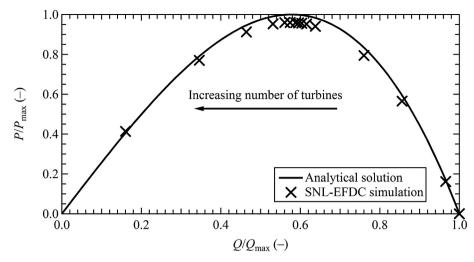


Fig. 2. Location of the CEC fence across 20 cells in the throat of the tidal channel.

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**Fig. 3.** Comparison of the Garrett and Cummins [4] analytical solution (curve) for power withdrawal  $(P/P_{\text{max}})$  as a function of normalized volumetric flow rate to the SNL-EFDC simulations (symbols).

scaled-turbine tests conducted in the IFREMER circulating water channel at Boulogne-sur-Mer in France [58] and at Saint Anthony Fall Laboratory (SAFL) at the University of Minnesota [59]. Table 2 describes each of the channels and discs/rotors used in the flume experiments.

For each of the models, uniform flows are specified at the flume inlets and constant water elevations are specified at the outlets. The particular model characteristics are listed in Table 3. Note that the modeled flume did not need to be as long as the actual flumes because data were only collected to 25 device diameters downstream and there was no need to model any further distances. Flume roughnesses were specified as 2 mm as appropriate for cement-bottom flumes. Using the average *x* velocity along a lateral transect five device diameters downstream from the turbine at hub height as the performance metric, grid-convergence indices were 3.8%, 3.2%, and 3.4% for the IFREMER, SAFL, and Chilworth models, respectively, which, according to Roache [60], Table 1, are considered acceptable. For these studies, the grid refinement ratio was two (in the horizontal only) and SNL-EFDC is second-order accurate in space.

## 4.2. Experimental data

For each experiment, the wake structure was characterized by up to four observation groups: (1) hub-height, centerline velocities at increasing distances downstream (longitudinal velocity profiles), (2) cross-wake velocities at one or more distances downstream (lateral velocity profiles), (3) depth-dependent velocities at one or more longitudinal distances downstream (vertical velocity profiles), and (4) turbulence intensities with distance downstream or in vertical profiles. Table 4 lists the available data for each experiment.

Data are reported as measured velocity, or more often as a

velocity deficit, the dimensionless ratio of the wake velocity at any location downstream of the CEC,  $U_{\rm w}$ , to the free-stream flow speed,  $U_{\infty}$ :

$$U_{\text{def}} = 1 - \frac{U_{\text{W}}}{U_{\text{m}}}.\tag{8}$$

The velocity deficit downstream of the rotor plane and along the CEC centerline decreases, on average, from about 60% at three device diameters downstream of the rotor plane to about 20–25% at 10 device diameters, 10D. Other studies indicate a recovery to 10% deficit within 15–20 device diameters downstream [56,62,66]. Because the converted power is proportional to the cube of the incoming velocity, optimal device spacing and arrangement for power performance is highly dependent upon the distance required for the wake to recover. The velocity deficit in the nearwake of a turbine (less than approximately three device diameters) is highly unstructured due to the turbulent flow shed from the hub/nacelle and turbine-blade roots and the velocity measurements fluctuate significantly.

# 4.3. Parameter estimation strategy

PEST (Parameter ESTimation) [67,68] was used to calibrate turbulence and flow parameters. PEST conducts gradient-based, nonlinear parameter estimation, based on the Gauss-Marquardt-Levenberg algorithm, and adjusts model parameters to minimize a weighted, least-squares objective function. PEST has also been applied for uncertainty assessments and sensitivity analyses [69]. For this study, calibration parameters are the three turbulence parameters ( $\beta_{\rm p}$ ,  $\beta_{\rm d}$ , and  $C_{\ell 4}$ ) and the two flow (momentum diffusion) parameters ( $\alpha_{\rm md}$  and  $K_{\rm v}$ ). A single set of turbulence parameters were calibrated for all three flume models because universal values are sought for flume experiments. Independent flow

**Table 2** Experimental descriptions.

Experiment	Channel			Rotor			Support Structure		
	Length (m)	Width (m)	Water depth (m)	Туре	Diameter (m)	C <sub>T</sub> (-)	Height (m)	Width (m)	C <sub>D</sub> (-)
Chilworth	21	1.35	0.3	Actuator disc	0.1	0.86	0.264	0.01	1.2
IFREMER	18	4	2	3-bladed turbine	0.8	0.77	0.94	0.1	1.2
SAFL	85	2.75	1.155	3-bladed turbine	0.5	0.58	0.425	0.1	1.2

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**Table 3** Model descriptions.

Model	Nominal grid cell size (cm <sup>2</sup> )	Number of cells	Number of layers	Total length and width (m <sup>2</sup> )	Depth (m)	Average flow speed (m/s)	Roughness (mm)
Chilworth	3.3 × 3.3	8610	27	6.3 × 1.35	0.3	0.28	2
IFREMER	16 × 16	2750	25	17.6 × 4	2.0	0.8	2
SAFL	10 × 10	4050	59	$15 \times 2.75$	1.155	0.4	2

**Table 4** Available data from each flume experiment.

Experiment	Longitudinal profile	Lateral profiles	Vertical profiles	Turbulence intensity
Chilworth	[56, Fig. 8]	[61, Fig. 16, 62, Fig. 5c]	[61, Fig. 15, 62, Fig. 5a]	[56, Fig. 12, 62, Figs. 5b,d]
IFREMER	[63, Fig. 9]	[63, Fig. 7]	[63, Fig. 8]	[64, Fig. 8]
SAFL	[65, Fig. 5]	Personal communication	[65, Fig. 2]	[65, Figs. 4 and 6]

parameters were calibrated simultaneously for each model because the varied flow rates, widths, and depths require unique estimates of these. The objective function is defined as the weighted sum of squared differences between measured velocity deficits and turbulence intensities ( $U_{\rm def}^*$  and  $TI^*$ ) and their simulated equivalents ( $U_{\rm def}$  and TI):

$$\Phi = \sum_{i} w_{i} \left( U_{\text{def}}^{*} - U_{\text{def}} \right)_{i}^{2} + \sum_{j} w_{j} (TI^{*} - TI)_{j}^{2}, \tag{9}$$

where w is the weight. Weights were user-specified and consider factors such as the importance of matching near- and far-wake velocity deficits. Because the model does not consider physical displacement of fluid by the turbine and support structure, all data points within the near wake (less than or equal to three device diameters) were weighted to w=0. Weights were increased near the tails of the longitudinal profiles to ensure that PEST honors these data and simulates a realistic wake recovery because the far wake is much more crucial for siting. Turbulence intensities were weighted to w=0.1 because these data were less certain and because the primary goal of this effort is to accurately simulate wake characteristics and not turbulence profiles.

Preliminary investigations revealed that the adjustable parameters could not uniquely be determined from only the longitudinal (centerline) velocity profile as it is not primarily sensitive to the turbulence parameters ( $\beta_p$ ,  $\beta_d$ , and  $C_{\ell 4}$ ). This led to many combinations of  $\alpha_{md}$ , and  $K_v$  that calibrated the model equally well. Inclusion of lateral and vertical velocity profiles and turbulence intensities in the objective function was necessary to uniquely estimate the parameters. This is unsurprising given that the lateral spreading of the wake depends upon diffusion through both global and device-generated turbulence. Unlike a natural system where  $\alpha_{md}$  and  $K_v$  would be calibrated against data from the undisturbed system,  $\alpha_{md}$  cannot be calibrated against uniform channel flows where no horizontal velocity gradients exist in the main body of the flow. Because undisturbed vertical velocity and turbulence

intensity profiles are available for the Chilworth and SAFL flumes, these were first used to establish an initial, preferred value for  $K_V = 3.2 \times 10^{-4} \text{ m}^2/\text{s}$  [53] and the initial turbulence parameter values came from Réthoré, Sørensen and Zahle [25].

#### 4.4. Parameter estimation results

The best-fit turbulence and flow parameters for each model are listed in Table 5 and Figs. 4–6 compare the PEST fits to each of the three experimental data sets. While PEST also reports parameter sensitivities as the change in objective function per unit change in parameter, it is difficult to interpret such values given that a unified set of turbulence parameters was sought and because calibration was across models of all three experiments at once. For example, because each model contributes individually to the overall objective function, but flow parameters only impact one model at a time, this obscures their sensitivities, especially with respect to the turbulence parameters, which impact all three models at once.

## 4.4.1. Fit to the Chilworth actuator disc experiment

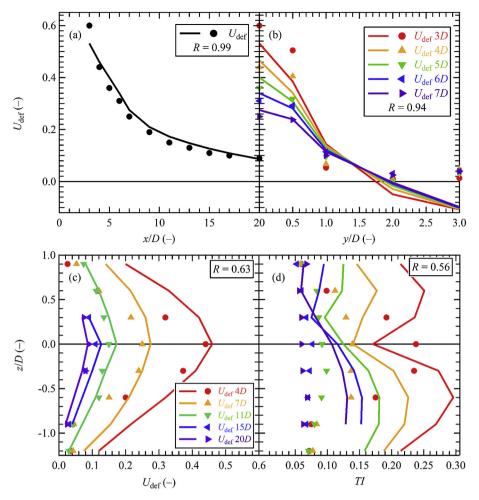
Fig. 4 compares the PEST fits to the data collected from the Chilworth actuator-disc flume experiment. Fig. 4(a) compares the measured longitudinal  $U_{\text{def}}$  profile (symbols) and best fit (curve) from 3 to 20D downstream. The simulated longitudinal velocity deficits match the measured Chilworth data well because, as with the experiment, the CEC module represents the turbine as an actuator disc, ignoring blade shape and nacelle obstruction. Fig. 4(b) presents lateral  $U_{\text{def}}$  profiles at transects from 3 to 7D downstream. At about 1.8D in the lateral direction, the best-fit, hub-height U<sub>def</sub> curves become negative, indicating the local velocity is faster than the hub-height free-stream velocity at the inlet. However, this is consistent with conservation of mass and SNL-EFDC demonstrating a persistent deficit over the experimental values near the free-surface, Fig. 4(c). As the measured data do not show a similar increase in velocity near the walls, this could be due to a slight error in the reported downstream water level that is not

**Table 5**Calibrated model parameters compared to previous values for vegetative canopies and wind turbine applications.

Parameter	Chilworth	IFREMER	SAFL	Vegetative [24]	Wind turbine [25]
$\beta_{\mathbf{p}} (-)^{\mathbf{a}}$ $\beta_{\mathbf{d}} (-)^{\mathbf{a}}$		←0.96 → ←1.38 →		1.0 1.0–5.0	0.05 1.5
$C_{\varepsilon 4}(-)^a$		←3.87→		0.9	1.6
$\alpha_{\rm md} (m^2/s)^b$ $K_{\rm v} (m^2/s)^b$	1.7 1.6 × 10 <sup>-4</sup>	1.1 4.7 × 10 <sup>-4</sup>	1.5 5.0 × 10 <sup>-4</sup>		

<sup>&</sup>lt;sup>a</sup> Turbulence parameter (global).

<sup>&</sup>lt;sup>b</sup> Flow parameter (system specific).



**Fig. 4.** PEST fits (curves) to the Chilworth data (symbols) for (a) hub-height longitudinal  $\underline{U}_{def}$  profile (3–20*D*), (b) hub-height lateral  $U_{def}$  profiles (3–7*D*), (c) vertical  $U_{def}$  profiles (4–20*D*), and (d) and vertical  $T_I$  profiles (4–20*D*). Flow is from left to right in (a), (c), (d) and from bottom to top in (b).

represented in the model because the outlet pressure condition is set to the reported depth listed in Table 2. Fig. 4(c) compares vertical  $U_{\text{def}}$  profiles at transects from 4 to 20D downstream. Fig. 4(d) presents vertical TI profiles at transects from 4 to 20D. Noteworthy is that simulated TIs are low along the disc centerline, which is consistent for introduction of TI at locations of high velocity gradients around the edges of a disc. While the Chilworth experimental data show only one location of increased TI directly behind the disc, this is different from the bi-modal pattern reported by Stallard, Collings, Feng and Whelan [70] and seen in the SNL-EFDC results. Note that the correlation coefficients, R, listed on the figures are fairly strong for the velocity deficits but weaker for TI. This is due in part because TI data were not weighted as heavily during calibration and because the RANS formulation and the numerical grid inherently limit how well these derived quantities can be matched.

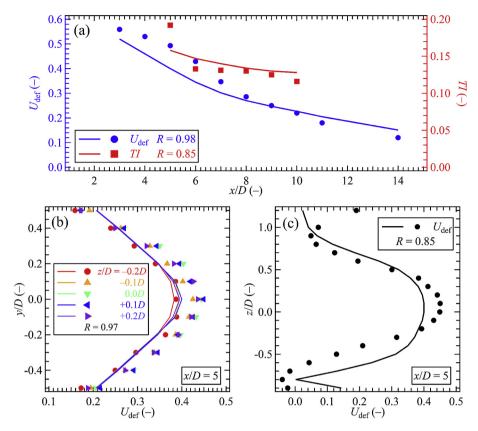
## 4.4.2. Fit to the IFREMER scaled-turbine experiment

Fig. 5 shows the PEST fits to the data collected from the IFREMER flume experiment. Fig. 5(a) shows the measured longitudinal  $U_{\rm def}$  profile (blue squares) and best fit (blue curve) from 3 to 14D downstream on the left axis and TI (red circles) and best fit (red curve) from 5 to 10D downstream on the right axis. Fig. 5(b) shows the lateral  $U_{\rm def}$  profiles from  $\pm 0.2D$  in the vertical in increments of 0.1D at a distance of 5D downstream from the turbine. Fig. 5(c) shows the vertical  $U_{\rm def}$  profile at a distance of 5D downstream from

the turbine. There are inflection points in the vertical  $U_{\text{def}}$  profile toward both the bottom and top of the flume. While the inflection point near the bottom of the flume is due to boundary layer development, the measured  $U_{\text{def}}$  deviation near the water surface is likely due to inherent limitations of ADCP measurements near the free surface. As a result, the top two data points in the vertical profile were not weighted during calibration. Note that the predicted centerline  $U_{\text{def}}$  for both the lateral and vertical profiles, Fig. 5(b) and (c), demonstrate slight underestimates of the velocity deficit as the wake is re-energized by the surrounding flow, but the centerline velocities are captured well as inferred from Fig. 5(a) where R = 0.98. A contributing factor as to why the peak deficit is not achieved is because the turbine hub is not explicitly represented in SNL-EFDC, which represents turbines as porous blockages instead of requiring zero normal velocities at turbine structures. Nevertheless, the correlation coefficients indicate that the model simulates the wake characteristics of this turbine well, especially for the longitudinal velocity profile, which is important to know so that devices can be optimally spaced in an array.

## 4.4.3. Fit to the SAFL scaled-turbine experiment

Fig. 6 compares the PEST fits to the data collected from the SAFL flume experiment. Fig. 6(a) shows the measured longitudinal  $U_{\rm def}$  profile downstream from the turbine centerline and edge of the turbine blades (blue and red curves, respectively) from 1 to 20D downstream. The model slightly under-predicts  $U_{\rm def}$  in the near-



**Fig. 5.** PEST fits (curves) to the IFREMER data (symbols) for (a) longitudinal  $U_{\text{def}}$  profile (3–14*D*) and  $\mathcal{I}I$  profile (5–10*D*), (b) lateral  $U_{\text{def}}$  profiles at 5*D*, and (c) vertical  $U_{\text{def}}$  profiles at 5*D*. Flow is from left to right in all panels.

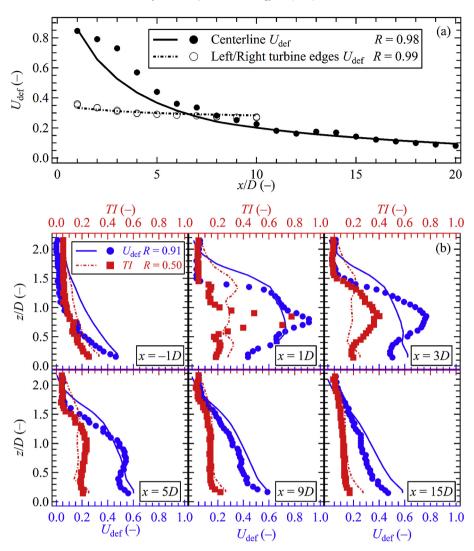
### 4.5. Discussion

Given that there are necessarily uncertainties in the measured data, the overall calibrations are acceptable and indicate that SNL-EFDC can be used to replicate flume experiments if baseline measures of the horizontal and vertical momentum diffusivities are known or calibrated. Consistent with the experimental data, the new CEC module predicts an approximate 60% decrease in velocity in the lee of the device with a wake recovery to within 10% of the freestream between 15 and 20D. Similarly, TI abruptly increases in the near-wake and dissipates to background levels within 10D. Despite increased system and measurement uncertainties in realworld systems, SNL-EFDC has recently been used to optimize array layouts [71]. In addition, the amount of simulation information produced for the low computational expense is notable, especially given that techniques are available to parallelize EFDC [30,31] or to run it on cloud computing systems [72].

Calibrated parameter values control the fit between experimental data and simulations. Some of the model-to-measurement

misfit is incurred when one observation group is better fit at the expense of another. Because the implementation of the  $k-k\ell$  turbulence model within SNL-EFDC was formulated for geographicscale obstructions, and not sub-grid-scale devices, the high, local shears and turbulence introduced by CEC devices are difficult to simulate. Because of this uncertainty, all TI data were weighted about an order of magnitude less than their  $U_{\text{def}}$  counterparts. Moreover, parameter covariance can complicate estimated parameter values. This means that the ratio of covarying parameters could be more accurately estimated than their individual values. Also, because PEST was used to fit all parameters simultaneously, the gradient-based approach may have found a local minimum, even though PEST [67,68] and the authors attempted to step out of such valleys (e.g., through PEST's regularization techniques and by the authors using appropriate initial parameter values). While there is correlation in estimated parameters across experiments,  $\alpha_{md}$  and  $K_v$  should be calibrated first in a system without CEC devices. Data collection for such a calibration effort is currently underway at a field site [73,74].

Overall, the vegetative-canopy model for momentum loss and turbulence generation implemented in SNL-EFDC shows some deficiencies in predicting the flows directly behind CEC devices in experimental flumes. Specifically, gradients in velocity deficits were often under-predicted in the lateral and vertical profiles. This indicates model structural error [75], which is the inability of a model to capture the true complexity of a physical system because the model is necessarily a simplification of reality and inherent deficiencies in representing complex geometries of the CEC obstructions (they act as porous barriers to flow). Moreover, SNL-EFDC is limited to a single, global value for the Smagorinsky constant,  $\alpha_{\rm md}$ . It is more likely that  $\alpha_{\rm md}$  (and  $K_{\rm v}$  as well) vary spatially and



**Fig. 6.** PEST fits (curves) to the SAFL data (symbols) for (a) longitudinal  $U_{\text{def}}$  profiles (1–20*D*) and (b) vertical  $U_{\text{def}}$  profiles at -1, 1, 3, 5, 9, and 15*D* (bottom *x* axis) and vertical *TI* profiles at -1, 1, 3, 5, 9, and 15*D* (top *x* axis). Flow is from left to right in all panels.

have different values in the free stream than in the wake. To the degree that parameters can compensate for model structural error, parameters may deviate from their measured physical value. Blackmore, Batten and Bahaj [76] have indicated the importance of background TI in wake recovery. Without being able to match background TI in the models because such data were not available from these experiments, it is expected that estimated parameters may deviate from their true values in an attempt to compensate for model structural error.

#### 5. Conclusions

A CEC module was incorporated into SNL-EFDC using a momentum sink approach with commensurate adjustments to the k- $k\ell$  turbulence transport equations. This facilitates simulation of power generation from CEC turbines at a regional flow scale while including local-scale changes due to momentum removal. The CEC module permits the use of different devices (i.e., varying size and thrust coefficient) in an arbitrary flow system. An analytic solution for power generation through a tidally forced channel was replicated with SNL-EFDC, which verified that maximum power production occurs when there is a reduction to 57% in the maximum

channel flow. A single set of empirical turbulence parameters required to replicate wake characteristics of in-stream devices were calibrated to match the wakes from three different experiments. Through inclusion of the CEC module into SNL-EFDC, hydrodynamic and environmental studies and optimizations can be performed simultaneously and tractably within a single modeling framework. This allows users to assess how increased power generation affects hydrodynamics, sediment dynamics, and even temperature and water quality. SNL-EFDC is an open-source code available to researchers, regulators, and the industry.

Future work will build upon the calibration framework developed here and compare the device parameters estimated from flume experiments to parameters estimated for a full-scale vertical axis turbine. This will reveal the degree to which parameters are device-specific and relevant across domains and scales. Also, because SNL-EFDC has both sediment-dynamics and water-quality modules, this modeling platform can easily be extended to addressing CEC impacts on these processes.

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EFDC Explorer [77] was used to visualize some of the model results.

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