

# Transient Turbulent Flow in a Liquid-Metal Model of Continuous Casting, Including Comparison of Six Different Methods

R. CHAUDHARY, C. JI, B.G. THOMAS, and S.P. VANKA

Computational modeling is an important tool to understand and stabilize transient turbulent fluid flow in the continuous casting of steel to minimize defects. The current work combines the predictions of two steady Reynolds-averaged Navier–Stokes (RANS) models, a “filtered” unsteady RANS model, and two large eddy simulation (LES) models with ultrasonic Doppler velocimetry (UDV) measurements in a small-scale liquid GaInSn model of the continuous casting mold region fed by a bifurcated well-bottom nozzle with horizontal ports. Both mean and transient features of the turbulent flow are investigated. LES outperformed all models while matching the measurements, except in locations where measurement problems are suspected. The LES model also captured high-frequency fluctuations, which the measurements could not detect. Steady RANS models were the least accurate methods. Turbulent velocity variation frequencies and energies decreased with distance from the nozzle port regions. Proper orthogonal decomposition analysis, instantaneous velocity patterns, and Reynolds stresses reveal that velocity fluctuations and flow structures associated with the alternating-direction swirl in the nozzle bottom lead to a wobbling jet exiting the ports into the mold. These turbulent flow structures are responsible for patterns observed in both the time average flow and the statistics of their fluctuations.

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## I. INTRODUCTION

OPTIMIZATION of fluid flow in the continuous casting process is important to minimize defects in steel products. Turbulent fluid flow in the submerged entry nozzle (SEN) and the mold are the main causes of entrainment of slag inclusions and the formation of surface defects.<sup>[1]</sup> Computational models combined with physical models are useful tools to study the complex turbulent flow in these systems.<sup>[2]</sup>

Reynolds-averaged Navier–Stokes (RANS) models and water models are among the most popular techniques to analyze these systems.<sup>[3–7]</sup> Relatively few studies have exploited accurate fine-grid large eddy simulations (LES) to quantify transient flow in the nozzle and mold of continuous casting of steel,<sup>[8–13]</sup> and even fewer have applied filtered unsteady RANS (URANS) models.<sup>[14]</sup> Yuan *et al.*<sup>[8]</sup> combined LES and particle image velocimetry (PIV) measurements in a 0.4-scale water model. The LES predictions matched well with the measurements. Transient oscillations were observed between two different flow patterns in the upper region—a wobbling stair-step downward jet and a jet that bends midway between the narrow face and the SEN. Long-term flow asymmetries were observed in the

lower region of the mold. Interaction of the flow from the two sides of the mold caused large velocity fluctuations near the top surface. Ramos-Banderas *et al.*<sup>[9]</sup> also found that LES model predictions agreed well with instantaneous velocity field measurements using digital PIV in a water model of a slab caster. Flow changed significantly because of vertical oscillations of the jet. Turbulence induced natural biasing without the influence of any other factors such as slide-gate, gas injection, or SEN clogging. Instantaneous velocity showed that periodic behavior and frequencies of this behavior were reported increasing with flow rate.

In another work, Yuan *et al.*<sup>[10]</sup> performed LES and inclusion transport studies in a water model and a thin slab caster. Complex time-varying structures were found even in nominally steady conditions. The flow in the mold switched between double-roll flow and complex flow with many rolls. Zhao *et al.*<sup>[11]</sup> performed LES with superheat transport and matched model predictions with plant and full-scale water model measurements. The jet exiting the nozzle showed chaotic variations with temperature fluctuations in the upper liquid pool varying  $\pm 4$  °C and heat flux  $\pm 350$  kW/m<sup>2</sup>. Adding the static-k subgrid scale (SGS) model had only minor effects.

Qian *et al.*<sup>[12]</sup> employed LES with direct current magnetic field effects in a slab continuous casting process. A new vortex brake was proposed, and its effect on vortex suppression was studied. The effect of the location of the magnetic field brake on vortex formation also was studied. The magnetic brake, when applied at free surface, suppressed turbulence and biased vortices significantly. Liu *et al.*<sup>[13]</sup> applied LES in a continuous casting mold to study the transient flow patterns in the

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upper region. The turbulent asymmetry in the upper region was reported in all instances. The upper transient roll broke into numerous small-scale vortices.

Few previous studies have been undertaken to evaluate the accuracy of turbulent flow simulations with measurements. One study<sup>[15]</sup> found that flow simulations using both LES with the classical Smagorinsky SGS model, and RANS with the standard  $k - \varepsilon$  (SKE) model, showed good quantitative agreement with time-average velocity measurements in a 0.4-scale water model using PIV and in an operating slab casting machine using an electromagnetic probe. Another study<sup>[16]</sup> showed that fine meshes were required and that imposing symmetry could drastically change the LES flow pattern.

This work investigates transient turbulent flow in the nozzle and mold of a typical continuous casting process by comparing computations with previous horizontal velocity measurements,<sup>[17–19]</sup> using ultrasonic Doppler velocimetry (UDV) in a GaInSn model of the process. In addition, it evaluates the accuracy and performance of five different computational models, including two LES models, a “filtered” URANS model, and two steady RANS models for such flows. In addition, Reynolds stresses, turbulent kinetic energy (TKE), and power spectra are presented and analyzed. The LES instantaneous velocities were also processed to perform proper orthogonal decomposition (POD) to identify significant modes in the turbulent velocity fluctuations.

## II. VELOCITY MEASUREMENTS USING UDV

Velocity measurements were performed in a GaInSn model of the continuous casting process at Forschungszentrum Dresden-Rossendorf (Dresden, Germany).<sup>[17–19]</sup> Figures 1(a), (b), and (c) respectively show the front, side, and bottom views of the model. The GaInSn eutectic metal alloy is liquid at room temperature (melting point  $\sim 283$  K ( $\sim 10$  °C)). Liquid GaInSn from the tundish flows down a 10-mm diameter, 300-mm-long SEN, exiting through two horizontal (0 deg) nozzle ports into a Plexiglas mold with 140 mm (width)  $\times$  35 mm (thickness) and a vertical length of  $\sim 300$  mm. The bifurcated nozzle ports were rectangular 18-mm high  $\times$  8-mm wide, with 4-mm radius chamfered corners. The liquid metal free surface level was maintained around 5 mm below the mold top. The liquid metal flows out of the mold bottom from two 20-mm diameter side outlet pipes.

UDV was used to measure horizontal velocity in the mold midplane between wide faces by placing 10 ultrasonic transducers along the narrow face spaced 10 mm apart vertically and facing toward the SEN. Each transducer measured instantaneous horizontal velocity along a horizontal line comprising the axis of the ultrasound beam. The velocity histories were collected along the 10 lines for around 25 seconds to create 125 frames. These measurements were performed using a DOP2000 model 2125 velocimeter (Signal Processing SA, Lausanne, Switzerland) with 10, 4-MHz transducers (TR0405LS, active acoustic diameter 5 mm). More details on these measurements can be found in References 17 through 19.

## III. COMPUTATIONAL MODELS

### A. Standard $k - \varepsilon$ Model (SKE)

In steady-state RANS methods, the ensemble-averaged mass (continuity) and momentum balance equations are expressed as follows<sup>[20,21]</sup>:

$$\frac{\partial \bar{u}_i}{\partial x_i} = 0 \quad [1]$$

$$\frac{\partial \bar{u}_i}{\partial t} + \frac{\partial \bar{u}_i \bar{u}_j}{\partial x_j} = -\frac{1}{\rho} \frac{\partial \bar{p}^*}{\partial x_i} + \frac{\partial}{\partial x_j} \left( (v + v_t) \left( \frac{\partial \bar{u}_i}{\partial x_j} + \frac{\partial \bar{u}_j}{\partial x_i} \right) \right) \quad [2]$$

where the modified pressure is  $\bar{p}^* = \bar{p} + \frac{2}{3} \rho k$ . Equations [1] and [2] are solved after dropping the first term and using turbulent (eddy) viscosity, as follows:

$$v_t = C_\mu k^2 / \varepsilon \quad [3]$$

where the model constant  $C_\mu = 0.09$ . This approach requires solving two additional scalar transport equations for the  $k$  and  $\varepsilon$  fields. The standard  $k - \varepsilon$  model is widely used in previous work, and more details can be found in References 22 through 24. The enhanced wall treatment (EWT)<sup>[23,25,26]</sup> is used for wall boundaries and the equations are solved using FLUENT.<sup>[24]</sup>

### B. Realizable $k - \varepsilon$ Model (RKE)

The realizable  $k - \varepsilon$  (RKE) model<sup>[27]</sup> is another steady RANS model similar to the SKE model. This model ensures that Reynolds normal stresses are positive and satisfies the Schwarz inequality ( $\overline{u'_i u'_j}^2 \leq \overline{u'^2_i} \overline{u'^2_j}$ ), which may be important in highly strained flows. These “realizable” conditions are achieved by making  $C_\mu$  a special function of the velocity gradients and  $k$  and  $\varepsilon$ . In addition to  $C_\mu$ , the RKE model also has some different terms in the dissipation rate ( $\varepsilon$ ) transport equation, which is derived from the exact transport equation of mean-square vorticity fluctuations,  $\varepsilon = \nu \overline{\omega_i \omega_i}$ , where vorticity  $\omega_i = \frac{\partial u'_k}{\partial x_j} - \frac{\partial u'_j}{\partial x_k}$ . More details on the formulations of RKE are given in References 23, 24, and 27.

### C. “Filtered” Unsteady RANS Model (URANS)

URANS models solve the transient Navier–Stokes Eqs. [1] and [2]. Results with SKE URANS always exhibit excessive diffusion and, in some flows, almost match steady RANS, showing almost no time variations.<sup>[28]</sup> In the “filtered” URANS approach, the eddy viscosity is decreased to lessen this problem of excessive diffusion while capturing the large-scale transient features of turbulent flows. Johansen *et al.*<sup>[28]</sup> improved on the SKE model by redefining the turbulent viscosity as follows:

$$v_t = C_\mu \min(1.0, f) k^2 / \varepsilon \quad [4]$$

where  $f = \Delta \varepsilon / k^{3/2}$ , and  $\Delta$  is the constant filter size defined as the cube root of the maximum cell volume in the domain or 2.16 mm here. For fine grids,  $f$  is smaller than 1, so  $v_t$  decreases, and less “filtering” of the velocities occurs relative to the standard SKE URANS.

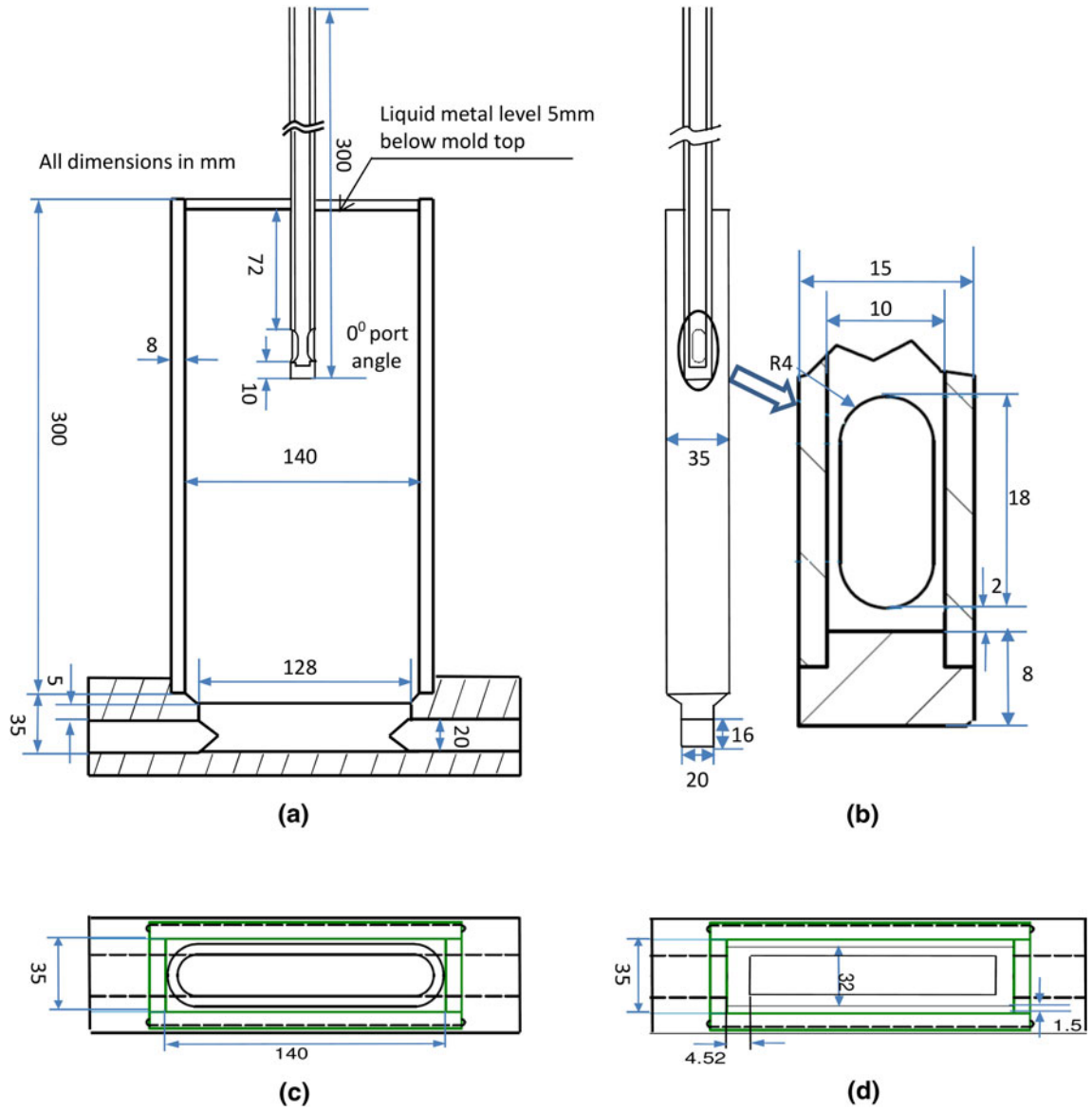


Fig. 1—Geometry of GaInSn model of continuous casting<sup>[17–19]</sup> in mm. (a) Front view of the nozzle and mold apparatus, (b) side view of the model domain with approximated bottom, (c) bottom view of the apparatus, and (d) bottom view showing approximation of circular outlets with equal-area rectangles.

This turbulent viscosity model was implemented in the current work into the SKE model in FLUENT via a user-defined function (UDF) and solved with EWT at wall boundaries.

#### D. Large Eddy Simulations with CU-FLOW<sup>[29–31]</sup>

The three-dimensional (3-D) time-dependent filtered Navier–Stokes equations and continuity equation for large eddy simulations can be written as follows<sup>[20,21]</sup>:

$$\frac{\partial u_i}{\partial x_i} = 0 \quad [5]$$

$$\frac{\partial u_i}{\partial t} + \frac{\partial u_i u_j}{\partial x_j} = -\frac{1}{\rho} \frac{\partial p^*}{\partial x_i} + \frac{\partial}{\partial x_j} \left( (v + v_s) \left( \frac{\partial u_i}{\partial x_j} + \frac{\partial u_j}{\partial x_i} \right) \right) \quad [6]$$

where the modified pressure is  $p^* = p + \frac{2}{3} \rho k_r$  and  $k_r$  is residual kinetic energy.

The SGS viscosity  $\nu_s$ <sup>[21]</sup> needed to “close” this system can be found using any of several different models, including the classical Smagorinsky model,<sup>[32]</sup> dynamic Smagorinsky–Lilly model,<sup>[33–35]</sup> dynamic kinetic energy SGS model,<sup>[36]</sup> and the wall-adapting local eddy-viscosity (WALE) model.<sup>[37]</sup> Among these popular models, the WALE model is mathematically more reasonable and accurate in flows involving complicated geometries.<sup>[37]</sup> This model captures the expected variation of eddy viscosity with the cube of distance close to the wall without any expensive or complicated dynamic procedure or need of Van-driest damping as a function of  $y^+$ , which is difficult in a complex geometry.<sup>[37]</sup> The WALE SGS

model is used in the current work and is defined as follows<sup>[37]</sup>:

$$v_s = L_s^2 \frac{(S_{ij}^d S_{ij}^d)^{3/2}}{(S_{ij} S_{ij})^{5/2} + (S_{ij}^d S_{ij}^d)^{5/4}} \quad [7]$$

where  $S_{ij} = \frac{1}{2} \left( \frac{\partial u_i}{\partial x_j} + \frac{\partial u_j}{\partial x_i} \right)$ ,  $S_{ij}^d = \frac{1}{2} (g_{ij}^2 + g_{ji}^2) - \frac{1}{3} \delta_{ij} g_{kk}^2$ ,  $g_{ij}^2 = g_{ik} g_{kj}$ ,  $g_{ij} = \frac{\partial u_i}{\partial x_j}$ ,  $\delta_{ij} = 1$ , if  $i = j$ , else  $\delta_{ij} = 0$ , and  $\Delta = (\Delta x \Delta y \Delta z)^{1/3}$ ,  $\Delta x$ ,  $\Delta y$ , and  $\Delta z$  are the grid spacing in  $x$ ,  $y$ , and  $z$  directions.

For the CU-FLOW LES model, the length scale is defined as  $L_s = C_w \Delta$ ,  $C_w^2 = 10.6 C_s^2$ <sup>[37]</sup> and  $C_s$  is the Smagorinsky constant taken to be 0.18.<sup>[37]</sup> The advantage of this method is that the SGS model viscosity converges toward the fluid kinematic viscosity  $\nu$  as the grid becomes finer and  $\Delta$  becomes small.

#### 1. Near-wall treatment

A wall-function approach given by Werner-Wengle<sup>[38]</sup> is used for the LES models to compensate for the relatively coarse mesh necessarily used in the nozzle and the highly turbulent flow ( $Re \sim 41,000$ , based on nozzle bore diameter and bulk axial velocity). This wall treatment assumes a linear profile ( $U^+ = Y^+$  for  $Y^+ = y u_\tau / \nu \leq 11.8$ ) combined with a power law profile ( $U^+ = A(Y^+)^B$  for  $Y^+ > 11.8$ ) for the instantaneous tangential velocity in each cell next to a wall boundary, assuming  $A = 8.3$ ,  $B = 1/7$ . These velocity profiles are analytically integrated in the direction normal to the wall to find the cell-filtered tangential velocity component  $u_p$  in the cell next to the wall, which is then related to instantaneous filtered wall shear stress.<sup>[38]</sup>

When  $|u_p| \leq \mu / (2\rho \Delta z) A^{2/(1-B)}$  (i.e., the cell next to the wall is in viscous sublayer), the wall stress in the tangential momentum equations is imposed according to the following standard no slip wall boundary condition:

$$|\tau_w| = 2\mu |u_p| / \Delta z \quad [8]$$

where  $\Delta z$  is the thickness of the near-wall cell in the wall normal direction.

Otherwise, when  $|u_p| > \mu / (2\rho \Delta z) A^{2/(1-B)}$ , the wall stress in Eq. [8] is replaced by the following wall stress defined by Werner-Wengle<sup>[38]</sup>:

$$|\tau_w| = \rho \left[ (1 - B) / 2 A^{1+B} (\mu / (\rho \Delta z))^{1+B} + \frac{1+B}{A} (\mu / (\rho \Delta z))^B |u_p| \right]^{\frac{2}{1+B}} \quad [9]$$

In both situations, the wall is impenetrable and the wall normal velocity is zero.

#### E. Large Eddy Simulations (LES) with FLUENT

The commercial code, FLUENT,<sup>[24]</sup> was also used to solve the same equations given in Section III-D, except  $L_s$  and  $C_s$  were defined as follows:

$$L_s = \min(\kappa d, C_w \Delta), \quad C_w^2 = 10.6 C_s^2, \quad \kappa = 0.418, \quad \text{and} \quad C_s = 0.10 \quad [10]$$

where  $d$  is distance from the cell center to the closest wall. The lower value of  $C_s = 0.10$  has been claimed to sustain turbulence better on relatively coarse meshes.<sup>[24,37,39]</sup>

## IV. MODELING DETAILS

The five different computational models were applied to simulate fluid flow in the GaInSn model described in Section III. The computational domains are faithful reproductions of the nozzle and mold geometries shown in Figure 1, except near the outlet. After realizing the small importance of the bottom region and the difficulty in creating hexahedral meshes, the circular bottom outlets are approximated with equal-area rectangular outlets. This approximation also changes the shape of the mold bottom, as shown in Figures 1(c) and (d). More details on the dimensions, process parameters (casting speed, flow rate, *etc.*) and fluid properties (density and viscosity)<sup>[17–19]</sup> are presented in Table I.

#### A. Domains and Meshes

To minimize computational cost, the two-fold symmetry of the domain was exploited for the RANS (RKE and SKE) simulations. Specifically, one quarter of the combined nozzle and mesh domain was meshed using a mostly structured mesh of  $\sim 0.61$  million hexahedral cells. Figures 2(a) and (b), respectively, show an isometric view of the mesh of the mold and port region used in the steady RANS calculations.

In the “filtered” URANS and LES calculations, time-dependent calculations of turbulent flow required a simulation of the full 3-D domain. The combined nozzle and mold meshes used in the URANS and LES-FLUENT simulations had similar cells as the steady RANS models, but with a total of  $\sim 0.95$  million and  $\sim 1.33$  million hexahedral cells, respectively. The LES-CU-FLOW simulation used a much finer mesh ( $\sim 5$  times bigger than LES-FLUENT) with  $\sim 7$  million ( $384 \times 192 \times 96$ ) brick cells. Figures 2(c) and (d), respectively, show the brick mesh used in LES-CU-FLOW near the nozzle port and mold midplane.

**Table I. Process Parameters**

Volume flow rate	110 mL/s
Nozzle inlet bulk velocity	1.4 m/s
Casting speed	1.35 m/min
Mold width	140 mm
Mold thickness	35 mm
Mold length	330 mm
Total nozzle height	300 mm
Nozzle port dimension	8 mm (width) $\times$ 18 mm (height)
Nozzle bore	10 mm/15 mm
diameter(inner/outer)	
Nozzle port angle	0 deg
SEN submergence depth	72 mm
Density ( $\rho$ )	6360 kg/m <sup>3</sup>
Dynamic viscosity ( $\mu$ )	0.00216 kg/m s



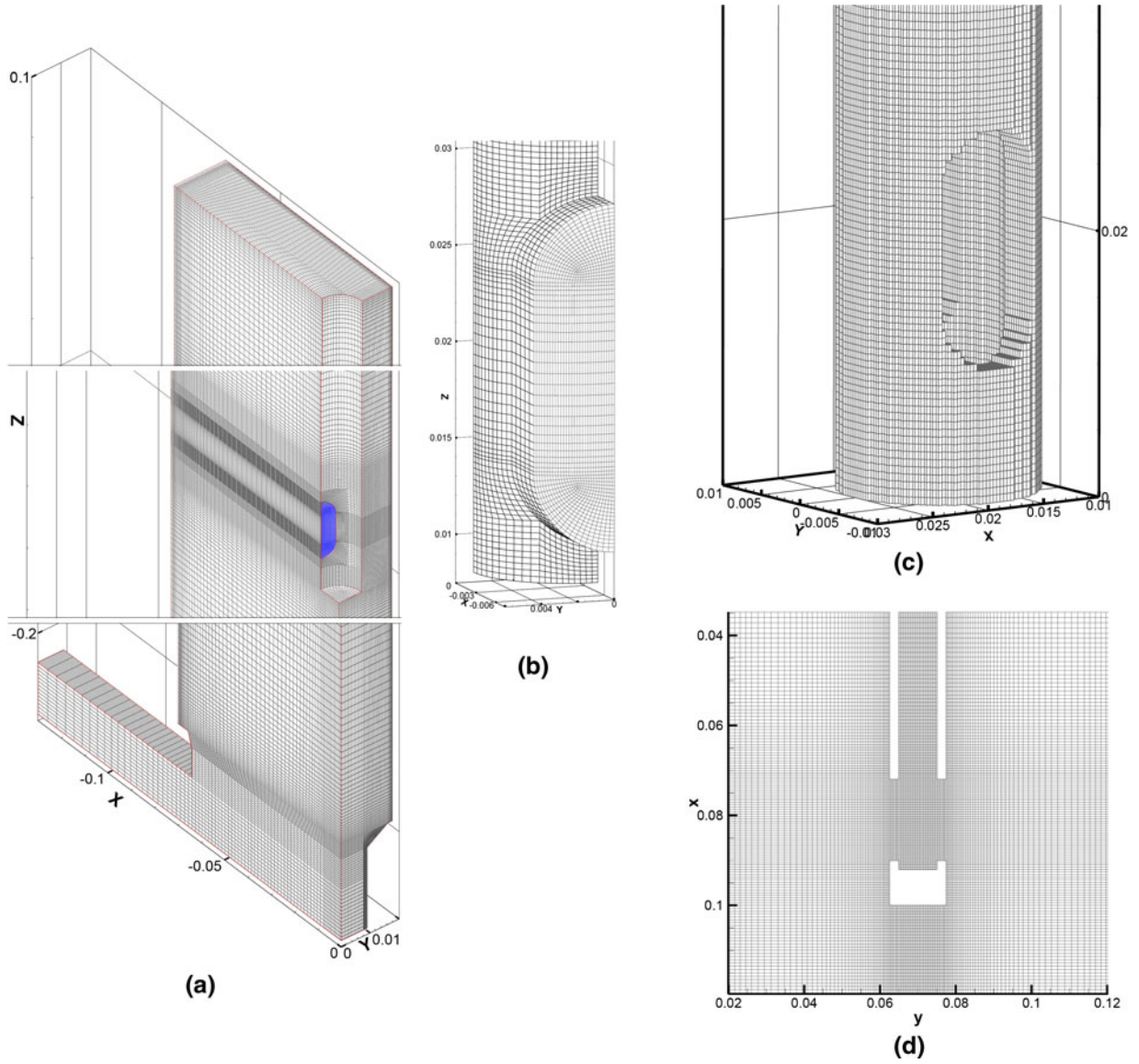


Fig. 2—Computational meshes. (a) Mold of steady RANS quarter-domain (~0.6 million cells), (b) nozzle port of steady RANS mesh, (c) nozzle mesh surfaces of LES-CU-FLOW (~7 million cells), and (d) mold midplane mesh of LES-CU-FLOW.

### B. Boundary Conditions

In the steady RANS and “filtered” URANS models, a constant velocity condition was used at the nozzle inlet ( $U_m = 1.4$  m/s, equivalent to 110 mL/s flow rate) with  $k$  and  $\varepsilon$  values of  $0.01964 \text{ m}^2/\text{s}^2$  and  $0.55 \text{ m}^2/\text{s}^3$ , respectively, calculated using relations ( $k = 0.01 U_m^2$ , and  $\varepsilon = k^{1.5}/0.05D$ , where  $D$  is the hydraulic diameter) given by Reference 40. The LES-FLUENT model used the same nozzle length and constant velocity profile and was fixed at the mean velocity without any perturbation. Flow in this straight pipe extending down from the tundish bottom developed accurate fully developed turbulence, owing to the long  $L/D = 30$ .

In LES-CU-FLOW, the nozzle bore was truncated at the level of the liquid surface in the mold to lessen the computational burden. This gives an  $L/D$  of  $\sim 7.2$ , which is not sufficient for flow to develop in the nozzle.

Because of this shorter bore length, an inlet mapping condition proposed in Reference 41 was implemented to make the flow develop within the short distance. In this condition, all three velocity components at the inlet were copied from a downstream section at  $L/D = 4$  with the axial velocity component multiplied by a factor of  $Q_{\text{required}}/Q_{\text{at } L/D=4}$  to maintain the desired flow rate ( $Q_{\text{required}}$ ) against frictional losses.

In both LES and RANS, the top surface of the mold was taken to be a free-slip boundary. All solid domain walls were given no-slip conditions using EWT in RANS (RKE and SKE) models and using the Werner-Wengle formulation in LES. In LES-FLUENT, the outlets at the mold bottom were given a constant pressure “outlet” boundary condition (0 Pa gauge). In LES-CU-FLOW, the domain outlets were truncated even with the narrow face walls, and the following convective outlet boundary

condition was implemented in implicit form for all three velocity components<sup>[42]</sup>:

$$\partial \vec{V} / \partial t + U_{\text{convective}} \partial \vec{V} / \partial n = 0, \text{ where } \vec{V} = u, v, w \quad [11]$$

where  $U_{\text{convective}}$  is set to the average normal velocity at the outlet plane. To maintain the required flow rate, the outlet normal velocity from Eq. [11] is corrected as follows between iterations:

$$u_{\text{normal}}^{\text{new}} = (Q_{\text{required}} - Q_{\text{current}}) / \text{Area}_{\text{outlet}} + u_{\text{normal}} \quad [12]$$

### C. Numerical Methods

During steady RANS calculations, the ensemble-averaged equations for the three momentum components, TKE ( $k$ -), dissipation rate ( $\epsilon$ -), and Pressure Poisson Equation (PPE) are discretized using the finite volume method (FVM) in FLUENT<sup>[24]</sup> with either first- or second-order upwind schemes for convection terms. Both upwind schemes were investigated to assess their accuracy. These discretized equations are then solved using the segregated solver for velocity and pressure using the semi-implicit pressure-linked equations (SIMPLE) algorithm, starting with the initial conditions of zero velocity in the whole domain. Convergence was defined when the unscaled absolute residuals in all equations was reduced to below  $1 \times 10^{-4}$ .

In “filtered” URANS calculations, the same ensemble-averaged equations as in steady SKE RANS with EWT were solved at each time step using the segregated solver in FLUENT after implementing the filtered eddy viscosity using a UDF. Convection terms were discretized using a second-order upwind scheme. The implicit fractional step method was used for pressure-velocity coupling with the second-order implicit scheme for time integration. For convergence, the scaled residuals were reduced by three orders of magnitude every time step ( $\Delta t = 0.004$  seconds). Starting from the initial conditions of zero velocity in the whole domain, turbulent flow was allowed to develop by integrating the equations for 20.14 seconds before collecting statistics. After reaching stationary turbulent flow with this method, velocities and turbulence statistics were then collected for ~31 seconds. URANS solves two additional transport equations for turbulence  $k$  and  $\epsilon$ , so it is slower than LES for the same mesh per time step. Adopting a coarser mesh, which allows for a larger time step, makes this method much more economical than LES overall. This issue will be discussed in the following computational cost section.

In LES-CU-FLOW, the filtered LES Eqs. [5] through [7] were discretized using the FVM on a structured Cartesian staggered grid. Pressure-velocity coupling is resolved through a fractional step method with explicit formulation of the diffusion and convection terms in the momentum equations with the PPE. Convection and diffusion terms were discretized using the second-order central differencing scheme in space. Time integration used the explicit second-order Adams–Bashforth scheme. Neumann boundary conditions are used at the walls for the pressure fluctuations ( $p'$ ). The PPE equation

was solved with a geometric multigrid solver. The detailed steps of this method are outlined in Chaudhary *et al.*<sup>[29]</sup> At every time step, residuals of PPE are reduced by three orders of magnitude. Starting with a zero velocity field, the flow field was allowed to develop for ~21 seconds and then mean velocities were collected for ~3 seconds (50,000 time steps,  $\Delta t = 0.0006$  seconds). Finally, mean velocities, Reynolds stresses, and instantaneous velocities were collected for another 25.14 seconds.

In LES-FLUENT, the filtered equations were discretized and solved in FLUENT using the same methods as the “filtered” URANS model, except for using a much smaller time step ( $\Delta t = 0.0002$  seconds), and basing convergence on the unscaled residuals. Flow was allowed to develop for 23.56 seconds before collecting results for another 21.48 seconds.

### D. Computational Cost

The computations with FLUENT (RANS, URANS, and LES) were performed on an eight-core PC with a 2.66 GHz Intel Xeon processor (Intel Corp., Santa Clara, CA) and 8.0 GB RAM, using six cores for steady RANS and LES and three cores for “filtered” URANS. The quarter-domain steady RANS models (RKE and SKE) took ~8 hours central processing unit (CPU) total time. The full-domain “filtered” URANS model took ~28 seconds per time step, or ~100 hours total CPU time for the 51-second simulation. Thus, the steady RANS models are more than one order of magnitude faster than URANS to compute the time-average flow pattern.

The full-domain LES-FLUENT model took ~26 seconds per time step or ~1626 hours (67days) total CPU time for the 225,200 time steps of the 45-second simulation [23.5 seconds flow developing + 21.5 (averaging time)]. Considering the similar mesh sizes, the “filtered” URANS model (0.95 million cells) is more than one order of magnitude faster than the LES model (1.33 million cells) using FLUENT. The steady RANS models are more than 200 times faster than this LES model because they can exploit a coarser mesh and finish in one step.

LES calculations using CU-FLOW were performed on the same computer but using the installed graphic processing unit (GPU). CU-FLOW took around 13 days to simulate ~48 seconds. Thus, LES-CU-FLOW is about five times faster than LES-FLUENT. Considering its five-times, better-refined mesh, (~7 million cells) and the six processing cores used by FLUENT, CU-FLOW is really more than two orders of magnitude faster than LES-FLUENT. This finding shows the great advantage of using better algorithms, which also can exploit the GPU.

## V. COMPARISON OF COMPUTATIONS AND MEASUREMENTS

The predictions of the five different computational models are first validated with pipe flow measurements and then compared with the UDV measurements in the mold apparatus. Additional comparisons between models and measurements in this apparatus are given

throughout the rest of this article, including comparisons of time-averaged velocities in the nozzle and mold, averaged turbulence quantities, and instantaneous velocity traces at individual points.

### A. Nozzle Bore

Flow through the nozzle controls flow in the mold, so the time/ensemble average axial velocity in the SEN bore is presented in Figure 3 comparing the model predictions with measurements by Zagarola *et al.*<sup>[43]</sup> of a fully developed pipe flow at a similar Reynolds number ( $Re_D = DU/\nu \sim 42,000$ ). All models match the measurements<sup>[43]</sup> closely, except for minor differences in the core and close to the wall. The RANS methods match well here because this is a wall-attached flow with a high Reynolds number, and these models were developed for such flows. The results from URANS are similar to steady SKE RANS and so are not presented. The velocity from LES-CU-FLOW also matches closely at both distances down the nozzle ( $L/D = 3$  and  $6.5$  below the inlet), which validates the mapping method described in Section IV-B to achieve fully developed, transient turbulent flow within a short distance. The minor differences are caused by the coarse mesh for this high Reynolds number preventing LES from completely resolving the smallest scales close to the wall. Overall, the reasonable agreement in the nozzle bore of all models with this measurement demonstrates an accurate inlet condition for the mold predictions.

### B. Mold

All five models are next compared with the UDV measurements in the liquid-metal-filled mold. Figure 4 compares the time/ensemble average horizontal velocity at the mold midplane as contour plots. Figure 5 compares these horizontal velocity predictions along three horizontal lines (95 mm, 105 mm, and 115 mm from mold top) at the mold midplane between wide faces. The time-averaging range for the three transient models were 31.19 seconds (SKE URANS), 21.48 seconds (LES-FLUENT), and 25.14 seconds (LES-CU-FLOW),

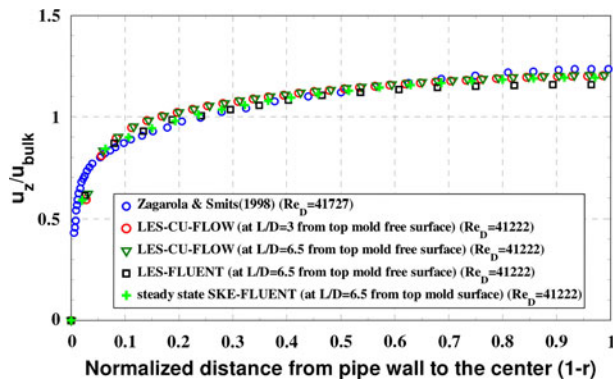


Fig. 3—Axial velocity along nozzle radius (horizontal bisector) predicted by different models compared with measurements of Zagarola *et al.*<sup>[43]</sup>

which can be compared with 24.87 seconds of time averaging of the measured flow velocities.

LES matches best with the measurements. Because of the small number of data frames in the measurements ( $\sim 125$  over 24.87 seconds), the time averages show some wiggles. Close to the SEN and narrow-face walls, the measurements produce inaccurate zero values, perhaps because of distance from the sensor and/or interference from the walls of the nozzle and narrow face. Its match with measurements along the three lines in Figure 5 is almost perfect. Furthermore, it matched well with the low values measured along seven other lines (not presented). Based on this agreement and its physically reasonable predictions near walls, the LES predictions are more accurate than the measurements, at least for the evaluation of the other models.

Minor differences between CU-FLOW and FLUENT LES predictions are noted. The CU-FLOW velocities show a wider spread of the jet with a stronger “nose” at port outlet compared to FLUENT. This effect is more realistic and physically expected because of the transient stair-stepping behavior of the swirling jet exiting the nozzle port. It shows that the flow pattern is resolved more accurately by CU-FLOW, owing to its much finer mesh ( $\sim 5.3$  times).

The other models show less accurate predictions than LES in both jet shape (Figure 4) and horizontal velocity profiles (Figure 5). The jet from steady SKE is thinner and directed straighter towards the narrow face, because this steady model cannot capture the real transient jet wobbling. More jet spreading is predicted with first-order upwinding than with the second-order scheme of the steady SKE model. This is caused by the extra numerical diffusion of the first-order scheme, which makes it match closer with both the measurements and the LES flow pattern. When considering its better numerical stability and simplicity, the first-order scheme is better than the higher order scheme for this problem. Among the steady RANS models (SKE and RKE), SKE matched more closely and was selected for URANS modeling and further steady RANS evaluations. The “filtered” URANS model resolves turbulence scales bigger than the filter size, and smaller scales are modeled with the two-equation  $k - \epsilon$  model. This model captures some jet wobbling and thus gives predictions that are somewhat between LES and steady RANS. Overall, all methods agreed reasonably well, with the RANS models being least accurate, URANS next, followed by measurements, LES-FLUENT, and LES-CU-FLOW being most accurate.

## VI. TIME-AVERAGED RESULTS

### A. Nozzle Flow

In addition to the line-plot comparison of axial velocity in the nozzle bore with measurements (Figure 3), model predictions of axial velocity contours and secondary velocity vectors are compared in Figure 6. The SKE, “filtered” URANS and LES-FLUENT models exhibit almost no secondary flows (Figure 6(a)). Interestingly, the stair-step mesh in CU-FLOW generates



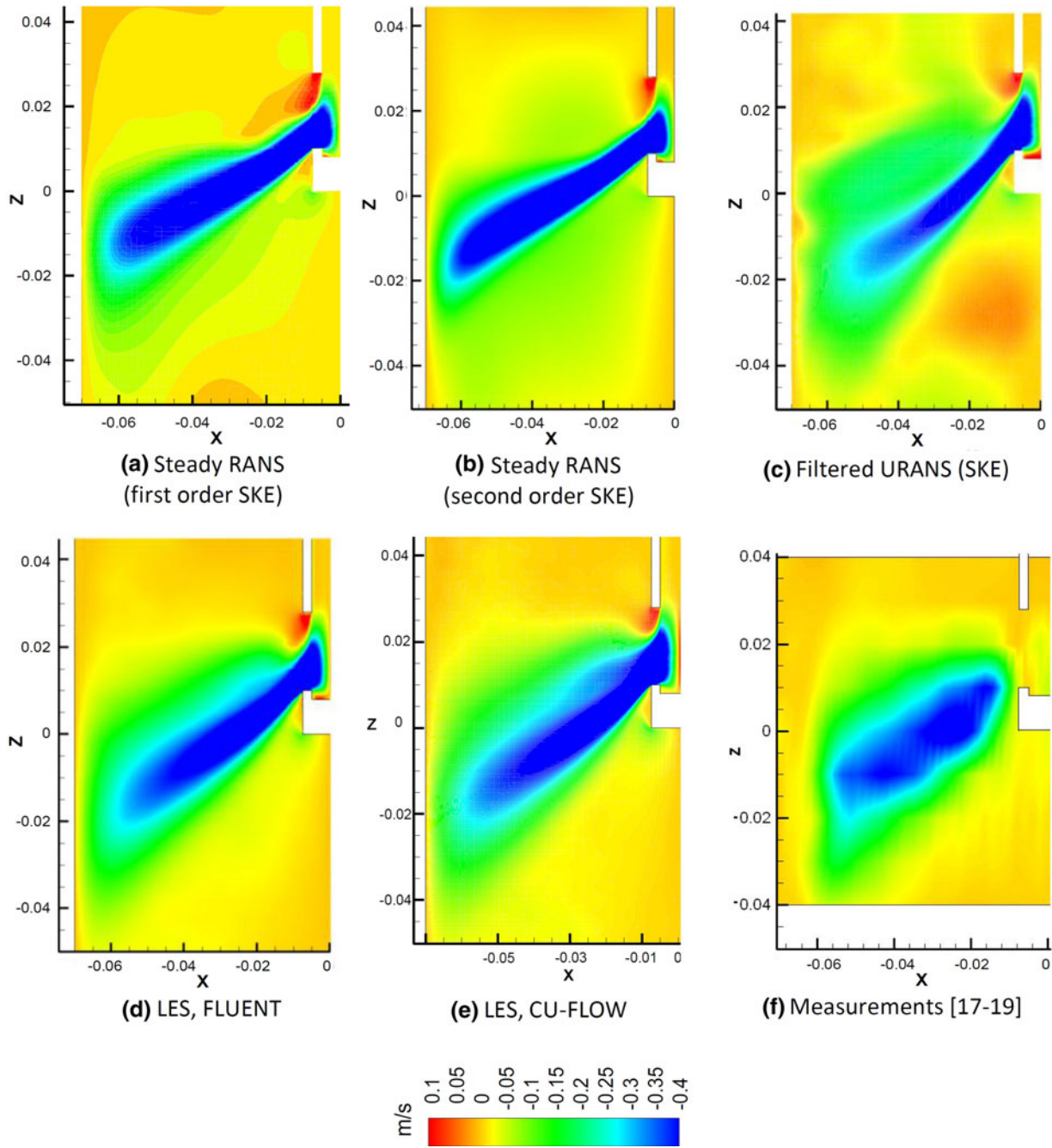


Fig. 4—Average horizontal velocity contours in the mold midplane compared with different models and measurements.

minor mean secondary flows that have a maximum magnitude of around  $\sim 2$  pct of the mean axial velocity through the cross section (Figure 6(b)). These secondary flows move toward the walls from the core in four symmetrical regions. This causes slight bulging of the axial velocity, which is similar to secondary flow in a square duct at the corners bisectors.<sup>[29]</sup> These small secondary flows have negligible effects on flow in the nozzle bottom and mold.

The jets leaving the nozzle ports directly control flow in the mold, so a more detailed evaluation of velocity in the nozzle bottom region was preformed. The predicted

velocity magnitude contours at the nozzle bottom midplane are compared in Figures 7(a) through (d). Qualitatively, the flow patterns match reasonably well in all models, except for minor differences in the steady SKE model. This reasonable match by steady SKE, comparable with other transient methods, is expected because of the high Reynolds number flow ( $Re \sim 42,000$ ) in the entire nozzle, for which a steady SKE model is most suitable. Flow patterns with LES-CU-FLOW and LES-FLUENT are similar.

The jet characteristics<sup>[44]</sup> exiting the nozzle port predicted by different models are summarized in Table II.



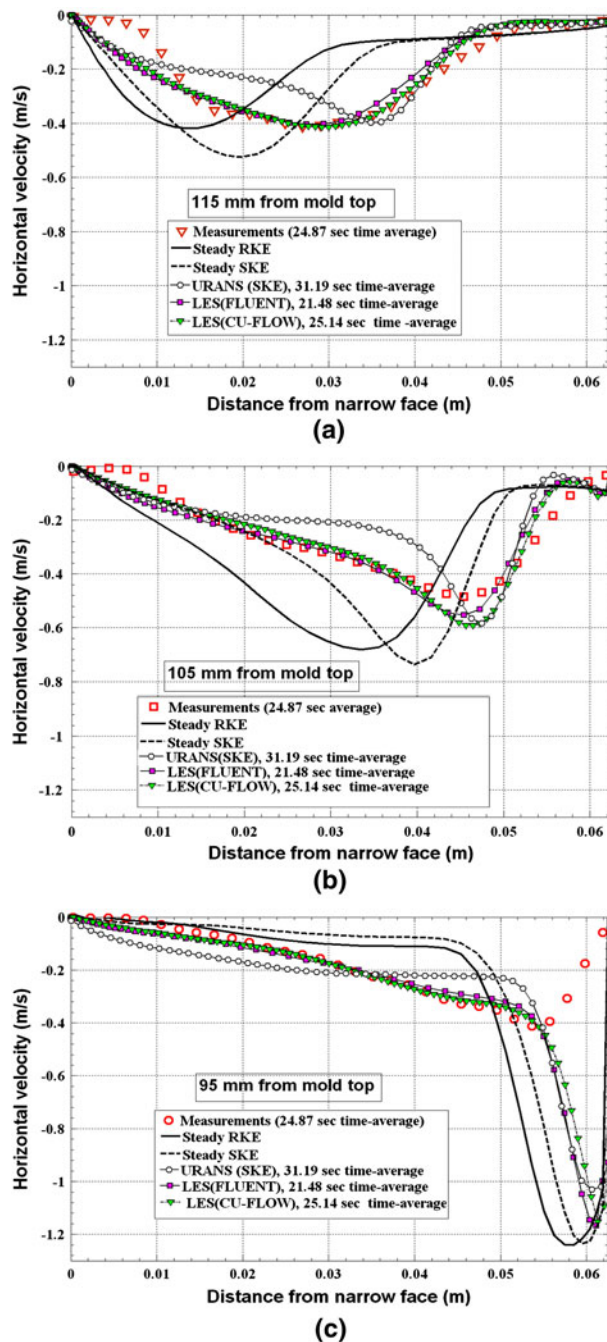


Fig. 5—Average horizontal velocity along three horizontal lines predicted by different models compared with measurements (a) 115 mm from mold top, (b) 105 mm from mold top, and (c) 95 mm from mold top.

Significant differences are observed between the different models. The steady SKE produces a bigger back-flow region (34 pct), and URANS produces a smaller back-flow region (17.6 pct) compared with LES-FLUENT (25.1 pct). Although the weighted downward velocity is similar (within ~8 pct) in all models, the weighted outward and horizontal velocities are different. Thus, the jet angles differ significantly, which greatly affects mold flow. The steady SKE model predicts the shallowest

downward jet angle, and the “filtered” URANS model predicts the steepest. The URANS model also predicts the largest horizontal spread angle (9.2 deg).

A comparison of velocity magnitude along the mid-port- and 2-mm-forward-offset vertical lines is presented in Figure 8. In the upper back flow region, all models agree, but significant differences are observed in the lower outward flow region. In the outward flow region, a high-velocity convex profile is predicted along the midport, whereas a lower velocity with a humped profile is noted along the offset line. This hump is caused by swirling flow inside the nozzle. Although LES-CU-FLOW and LES-FLUENT velocities generally match closely, larger differences are observed at the port. This difference is responsible for the slight differences in jet shape in the mold (Figure 4) discussed previously, and is a result of the more diffusive nature of the coarser mesh used for LES-FLUENT.

## B. Mold Flow

To show the mold flow pattern and continue comparing the different models, time-averaged velocity magnitude contours and streamlines are presented at the mold midplane in Figure 9. All models predict a classic symmetrical “double-roll” flow pattern, with two upper counter-rotating recirculation regions and two lower recirculation regions. Along the top surface, velocity from the narrow face to the SEN is slow, owing to the deep nozzle submergence. It might cause meniscus freezing surface defects in a real caster, but the flow system is useful for model evaluation.

The velocity contours are similar between the transient models, but significant differences are observed with steady SKE RANS, which underpredicts the jet spread. The thinner and more focused jet produces a higher velocity in both the upper and the lower recirculation regions. In addition, the jet angle is too shallow, causing even more excessive surface flow. The upper eye is too centered in overly rounded upper rolls, relative to the LES flow, in which the eye is closer to the narrow face. The lower eye is too high, relative to the elongated low eye of LES. These inaccuracies of SKE RANS are likely because of the assumption of isotropic turbulence and underprediction of swirl in the nozzle bottom, compounded by the recirculating nature of the flow, and the lower Reynolds number in the mold, which are known to cause problems.<sup>[23]</sup>

In the transient models, the jet region is dominated by small turbulence scales and so attains right-left symmetry after only ~1 to 2 seconds of time averaging. This contrasts with the lower rolls, which are still asymmetrical even after ~21 to 31 seconds time averaging, which suggests the dominance of large-scale structures in these regions. The upper rolls structures are intermediate. This asymmetry reduces with more time averaging. The “filtered” URANS is similar to the LES models but exhibits even more asymmetries in the upper and lower rolls.

The surface velocity predicted by different models at the mold midplane between wide faces is compared in Figure 10(a). The three transient methods all predict

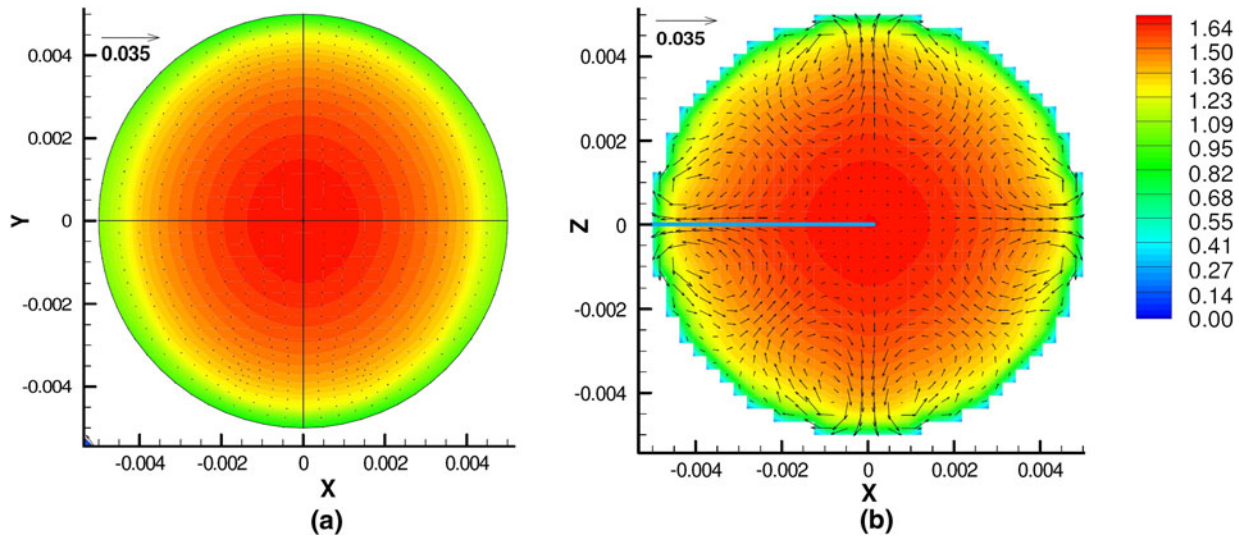


Fig. 6—Axial velocity (m/s) with secondary velocity vectors at nozzle bore cross section (a) steady SKE: ensemble-average and (b) LES-CU-FLOW: time average.

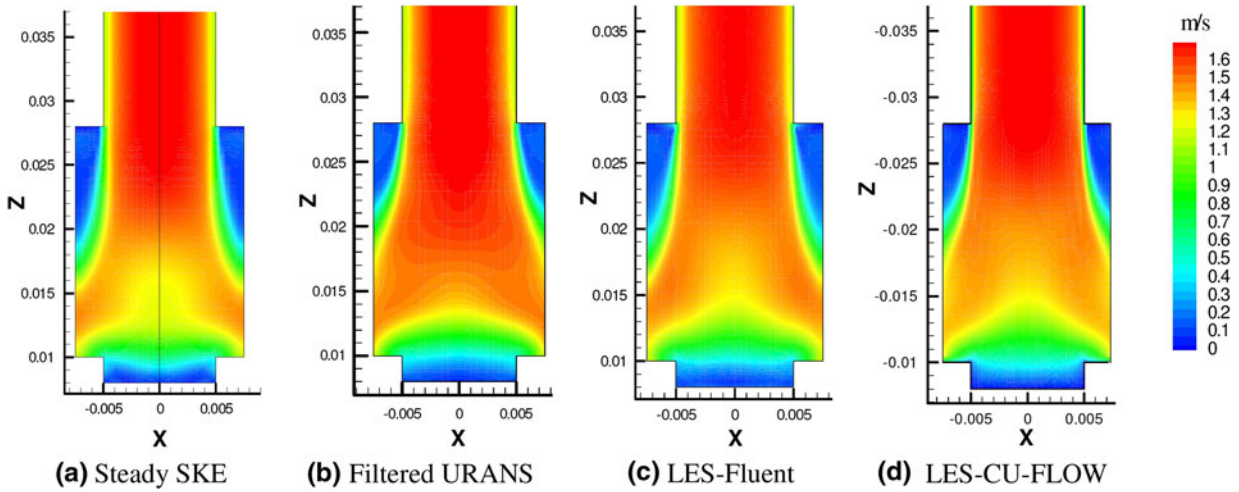


Fig. 7—Average velocity magnitude contours in nozzle midplane near bottom comparing (a) steady SKE, (b) filtered URANS, (c) LES-FLUENT, and (d) LES-CU-FLOW.

Table II. Comparison of the Jet Characteristics in Steady SKE, “Filtered” URANS and LES

Properties	Steady SKE Model Left Port	“Filtered” URANS (SKE) Left Port	LES Model (FLUENT) Left Port
Weighted average nozzle port velocity in $x$ direction (outward) (m/s)	0.816	0.577	0.71
Weighted average nozzle port velocity in $y$ direction (horizontal) (m/s)	0.073	0.0932	0.108
Weighted average nozzle port velocity in $z$ direction (downward) (m/s)	0.52	0.543	0.565
Weighted average nozzle port TKE ( $\text{m}^2/\text{s}^2$ )	0.084	0.0847	0.142
Weighted average nozzle port TKE dissipation rate ( $\text{m}^2/\text{s}^3$ )	15.5	15.8	—
Vertical jet angle (deg)	32.5	43.3	38.5
Horizontal jet angle (deg)	0.0	0.0	0.0
Horizontal spread (half) angle (deg)	5.1	9.2	8.6
Average jet speed (m/s)	0.97	0.8	0.91
Back-flow zone (pct)	34.0	17.6	25.1



similar trends, although values are different. The LES-CU-FLOW profile is slowest. The steady SKE model produces a different profile close to the SEN where it

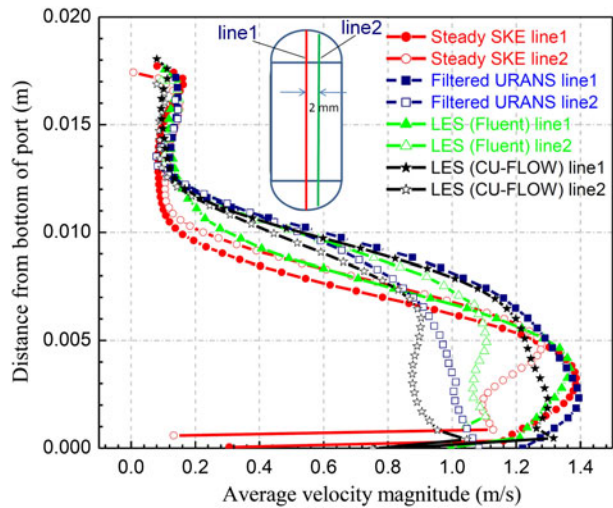


Fig. 8—Comparison of port velocity magnitude along two vertical lines in outlet plane.

predicts reverse flow toward the narrow face. Across the rest of the surface, the steady SKE model matches the other models. All surface velocities are slow, (five to seven times smaller than a typical caster  $[-0.3]$ ),<sup>[1]</sup> which is a major cause of the differences between models.

The vertical velocity across the mold predicted by different models 35 mm below surface at mold midplane is compared in Figure 10(b). The transient models all matched closely. Because the jet is thinner with a shallower angle, the steady SKE predicts much stronger recirculation in the upper zone, with velocity approximately five times faster up the narrow face and approximately two times faster downward near the SEN than LES.

The vertical velocity along a vertical line 2 mm from the narrow face wall at mold midplane is presented in Figure 11. The profile shape from all models is classic for a double-roll flow pattern.<sup>[5,6]</sup> This velocity profile also indicates the behavior of vertical wall stress along the narrow face. The positive and negative peaks match the beginning of the upper and lower recirculation zones, respectively. The crossing from positive to negative velocity denotes the stagnation/impingement point ( $\sim 110$  mm below the top free surface in all models). The transient models agree closely, except for minor differences in URANS in the lower recirculation.

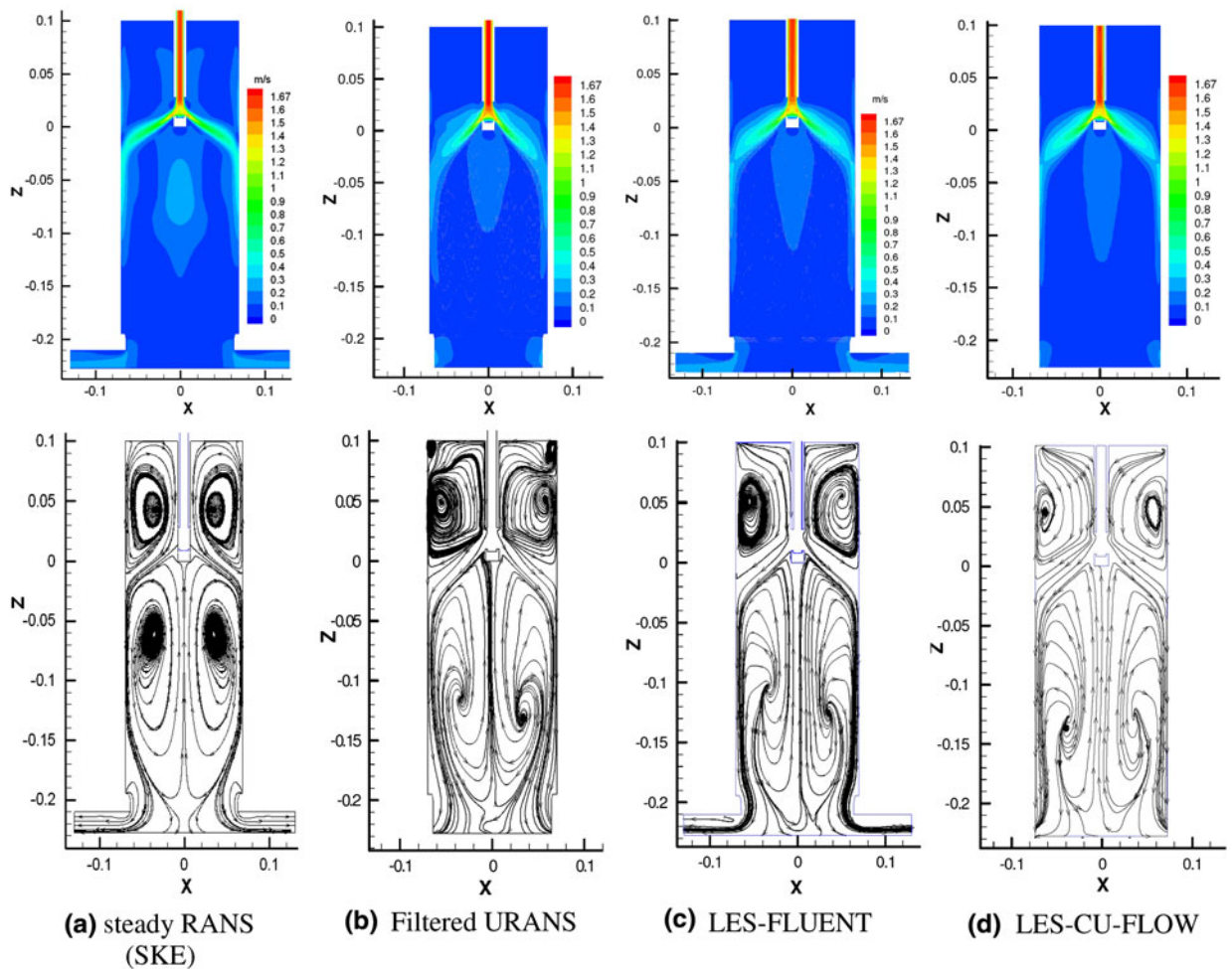


Fig. 9—Comparison of time/ensemble average velocity magnitude (above) and streamline (below) at the mold midplane between wide faces.



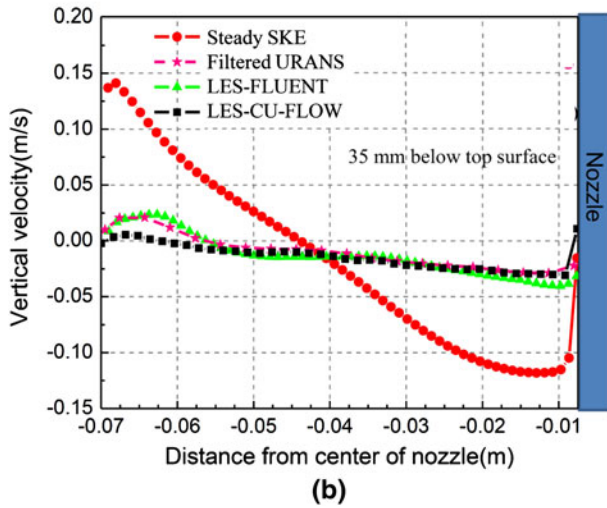
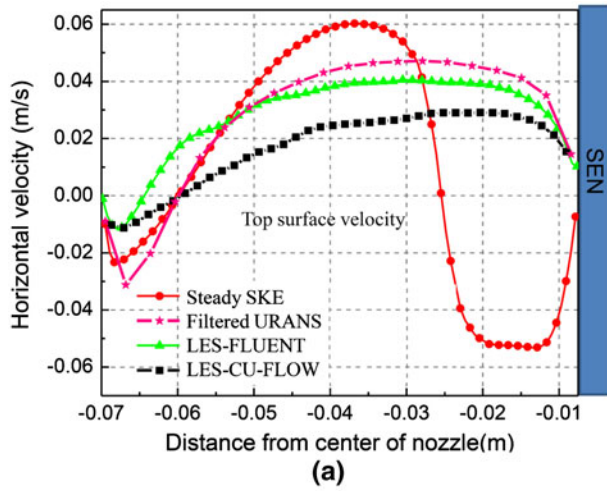


Fig. 10—Average velocity profile at mold midplane comparing different models. (a) Horizontal velocity at top surface and (b) vertical velocity at 35 mm below top surface.

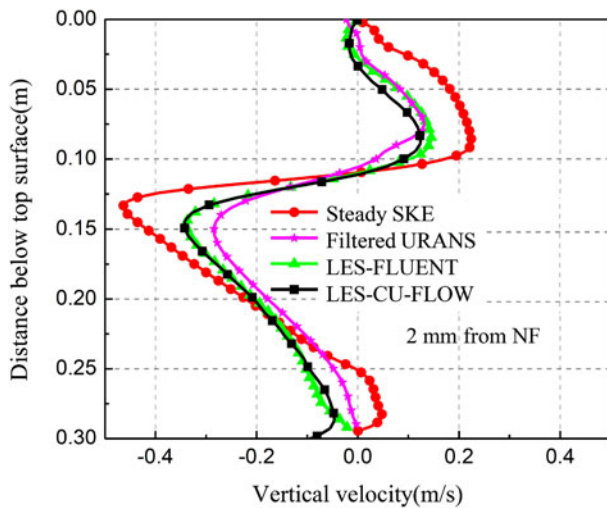


Fig. 11—Comparison of time/ensemble average vertical velocity in different models at 2 mm from NF along mold length.

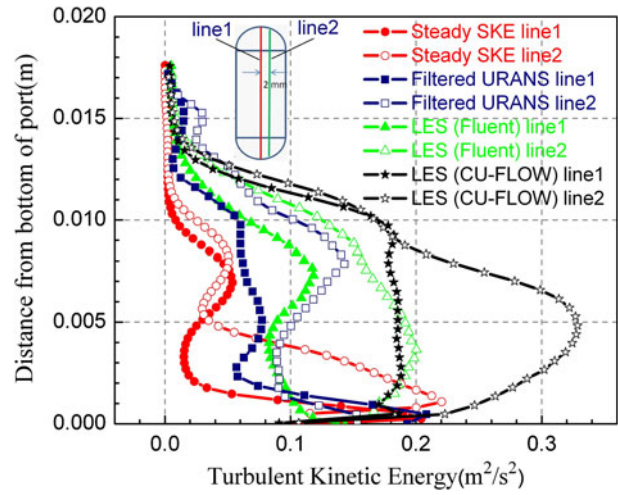


Fig. 12—Comparison of TKE predicted by different models along two vertical lines at the port.

Steady SKE predicts significantly higher extremes, giving higher positive values in the upper region and lower negative values in the lower region. This mismatch of steady SKE is consistent with the other velocity results and indicates that care must be taken when using this model.

### C. Turbulence Quantities

The TKE, Reynolds normal stress components comprise TKE, and Reynolds shear stress components are evaluated in the nozzle and mold, comparing the different models. Figure 12 compares TKE profiles along the nozzle port center- and 2-mm-offset vertical lines for four different models. As expected, TKE is much higher in the outward flowing region than in the reverse-flow region. TKE along the 2-mm-offset line is higher than along the center line.

The Steady SKE and URANS models greatly underpredict TKE along both lines. URANS does not perform any better than steady SKE in resolving turbulence in nozzle. The LES-FLUENT and LES-CU-FLOW models produce similar trends, but higher TKE is produced with LES-CU-FLOW owing to its better resolution. This process produces the strongly fluctuating nose in the mold that better matches the measurements. The TKE of LES-CU-FLOW is presented at the mold midplanes in Figure 13. Turbulence originates in the nozzle bottom, where a V-shaped pattern is observed, and decreases in magnitude as the jets move further into the mold.

The TKE of the RANS models (k) has a high error, underpredicting turbulence by ~100 pct in Figure 12, which is much higher than the 3 pct to 15 pct mismatch with the velocity predictions exiting the nozzle (Figure 8). The “filtered” URANS model performs slightly better, but still underpredicts TKE by ~40 pct. Similar problems of RANS models in predicting turbulence have been found in previous work in channels,<sup>[23]</sup> square ducts,<sup>[23]</sup> and continuous casting molds.<sup>[15]</sup> This trend is in large part a result of the RANS model

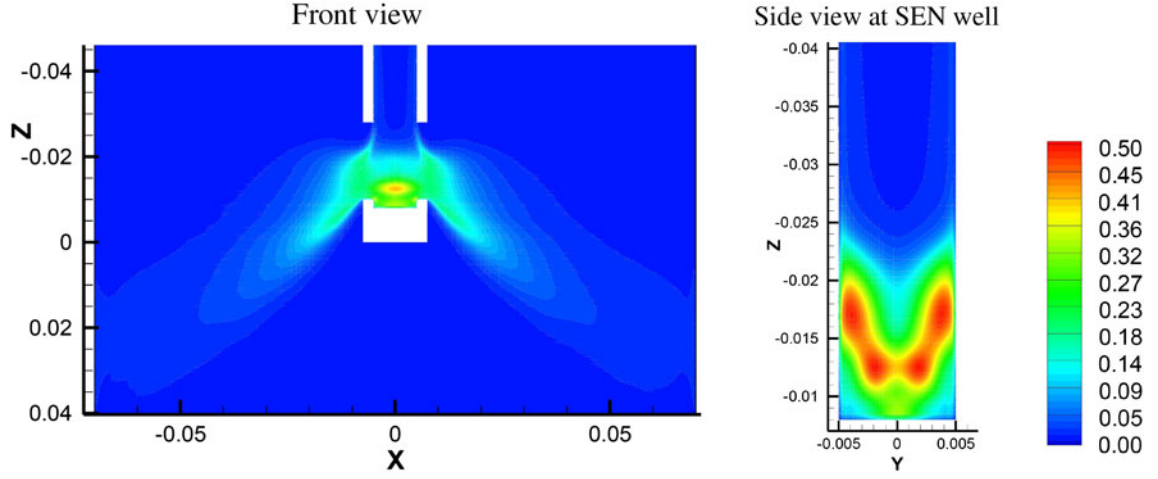


Fig. 13—Resolved TKE at mold midplanes between wide and narrow faces.

assumption that turbulence is isotropic, ignoring its variations in different directions. The TKE in LES is based on its true definition as the sum of the following three resolved components:

$$\text{TKE} = 0.5(\overline{u'u'} + \overline{v'v'} + \overline{w'w'}) \quad [13]$$

where  $\overline{u'u'}$ ,  $\overline{v'v'}$ , and  $\overline{w'w'}$  are the Reynolds normal stresses. The LES models predict all six independent components of the Reynolds stresses including the three normal and three shear components, which indicate interactions between in-plane velocity fluctuations.

The four most significant Reynolds stress components from the CU-FLOW LES model in the two mold midplanes are shown in Figure 14. The most significant turbulent fluctuations are in the  $y$ - $z$  plane (side view) near the bottom of the nozzle. These  $\overline{w'w'}$  and  $\overline{v'v'}$  normal Reynolds stress components signify the alternating rotation direction of the swirling flow in the well of the nozzle. The  $\overline{v'v'}$  out-of-plane fluctuation is the largest component in the front view. The  $\overline{w'w'}$  vertical component is the largest and most obvious component near the front and back of the nozzle bottom walls in the side view. Their importance is explored in more detail in Section VII-D. The  $x$ - $z$  plane components ( $\overline{w'w'}$ ,  $\overline{u'u'}$ , and  $\overline{u'w'}$ ) in the front view follow the up-down jet wobbling at the port exit, which causes the stair-stepping phenomenon.<sup>[8]</sup> These horizontal ( $\overline{u'u'}$ ) and vertical ( $\overline{w'w'}$ ) components show how this wobbling extends into the mold region, accompanied by the swirl, as evidenced by the  $\overline{v'v'}$  variations. Additional insight into the turbulent velocity fluctuations quantified by these Reynolds stresses is revealed from the POD analysis in Section VII-D.

## VII. TRANSIENT RESULTS

Having shown the superior accuracy of LES methodology, the predictions from CU-FLOW and LES-FLUENT were applied to continue investigating the transient flow phenomena. Specifically, the model

predictions of transient flow behavior are evaluated together with measurements at individual locations, followed by spectral analysis to reveal the main turbulent frequencies, and a POD analysis to reveal the fundamental flow structures.

### A. Transient Flow Patterns

Instantaneous flow patterns from three different transient models at the mold midplane are shown in Figures 15(a) through (c). These instantaneous snapshots of velocity magnitude were taken near the end of each simulation. Since the developed turbulent flow fields continuously evolve with time and fluctuate during this “pseudo-steady-state” period, there is no correspondence in time among the simulations. Each snapshot shows typical features of the flow patterns captured by each model. Because of the fine mesh, LES-CU-FLOW captures much smaller scales than LES-FLUENT. The flow field in URANS is a lot smoother because of a coarse mesh with a much larger spatial and temporal filter sizes. The instantaneous flow patterns are consistent with the mean flow field discussed previously. The maximum instantaneous velocity at the mold midplane is ~10 pct higher than the maximum mean velocity.

### B. Transient Velocity Comparison

Model predictions with LES-FLUENT and measurements of time histories of horizontal velocity are compared at five different locations in the mold, (points 1 through 5 in Figure 16), in Figure 17. The measurements were extracted using an ultrasonic Doppler shift velocity profiler with ultrasonic beam pulses sent from behind the narrow face wall into the GaInSn liquid along the transducer axis. Because of divergence of the beam, the measurement represents an average over a cylindrical volume, with ~0.7-mm thickness in the beam direction, and a diameter that increases with distance from the narrow face. Figure 16 shows the three beams (emitted from blue cylinders), their slightly diverging cylinders (red lines) (color figure online), and the

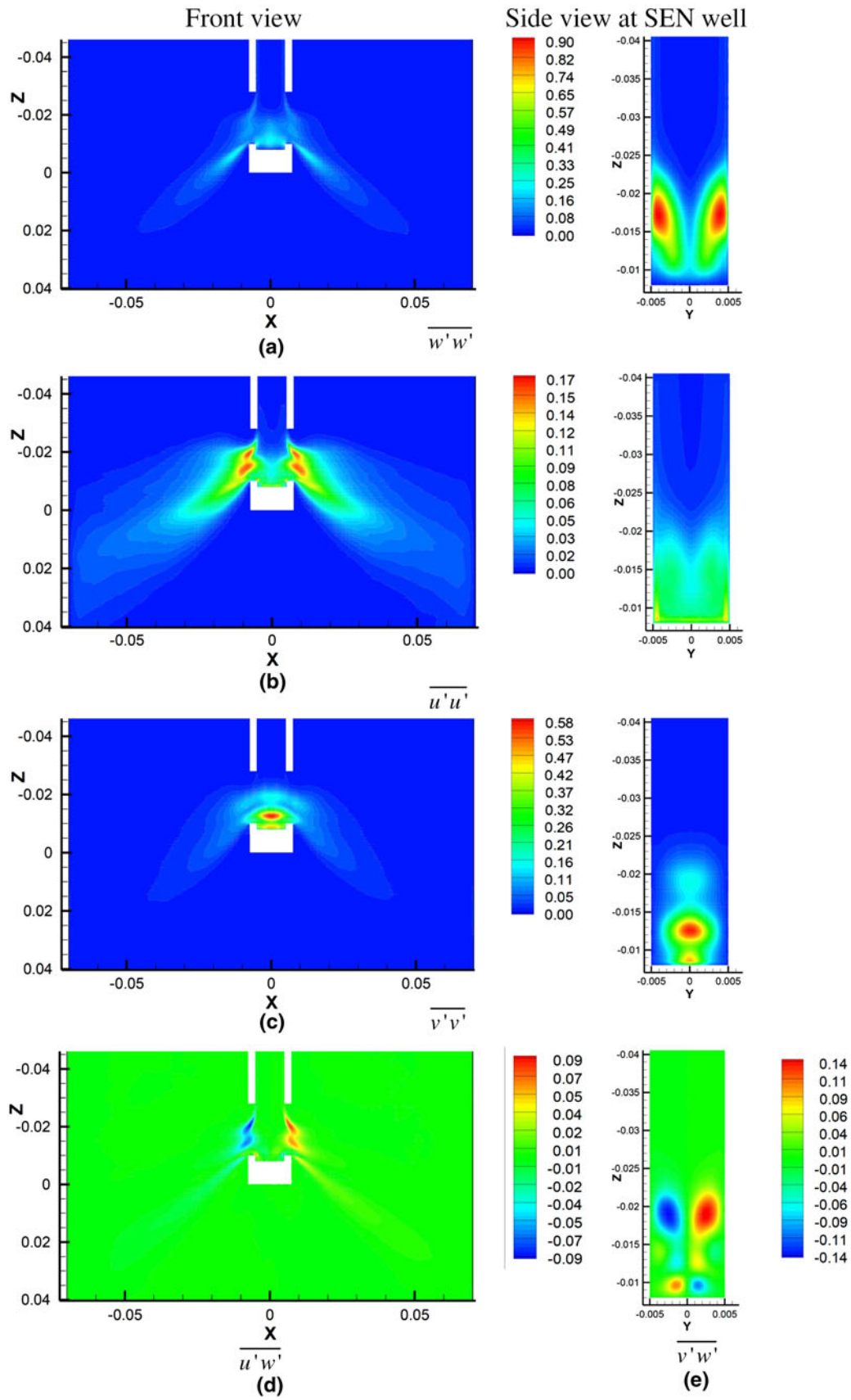


Fig. 14—Resolved Reynolds normal and in-plane shear stresses at mold midplanes between wide and narrow faces.



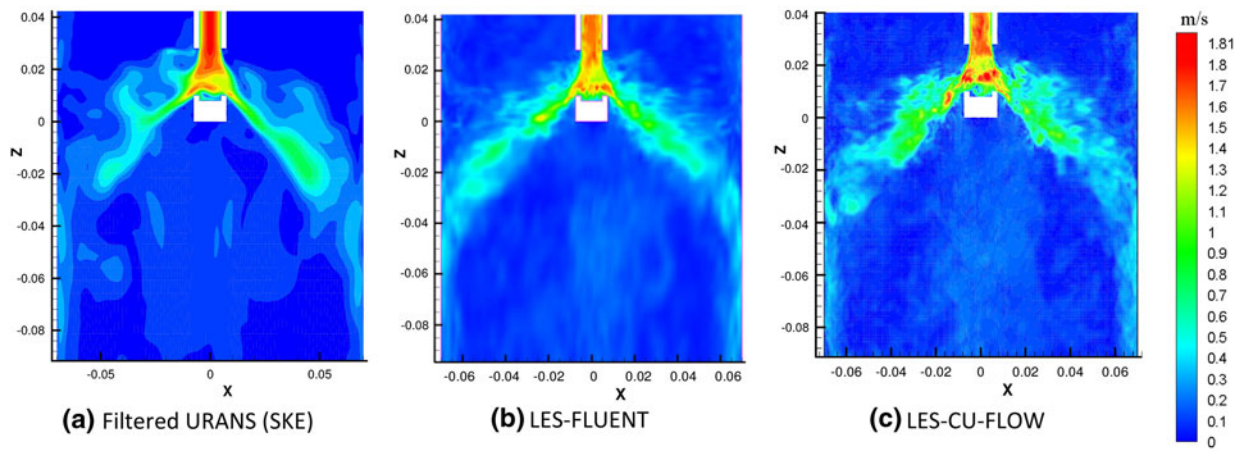


Fig. 15—Instantaneous velocity magnitude contours comparing different transient models.

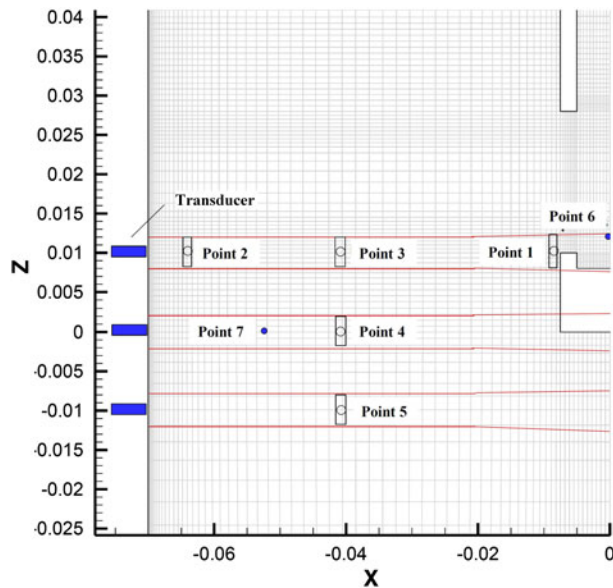


Fig. 16—Spatial-averaging regions in which instantaneous horizontal velocity points are evaluated in the midplane between widefaces. (Lines are boundaries of the cylindrical UDV measurement regions; coordinates in m).

averaging volumes (rectangles) for the points investigated here. The overall temporal resolution was  $\sim 0.2$  seconds for the data acquisition rate used to obtain the data presented here. To make fair, realistic comparisons with the high-resolution LES model predictions, spatial averaging over the same volumes and moving centered temporal averaging of 0.2 seconds was also performed on the model velocity results.

Close to the SEN at point 1 (Figure 17(a)), the horizontal velocity history predicted by LES greatly exceeds the inaccurately measured signal. The predicted velocity ( $\sim 1.2$  m/s) is consistent with the actual mass flow rate through the port. With spatial and temporal averaging included, the predicted time variations are similar to the measured signal. This figure also includes part of the actual LES velocity history predicted at this point, with a model resolution of  $\sim 0.0002$  seconds time

step and 0.2 to 2-mm grid spacing. This high-resolution prediction reveals the high-amplitude, high-frequency fluctuations expected close to the SEN for the large Reynolds number ( $Re = 42,000$ ) in this region.

The individual effects of temporal and spatial averaging are investigated at point 2 (Figure 17(b)). This point is near the narrow face above the mean jet impingement region and so has much smaller velocity fluctuations and significantly lower frequencies. Both temporal/spatial-averaging together, and temporal averaging alone bring the predictions closer to the measured history. Spatial averaging alone has only a minor effect.

Including temporal averaging smooths the predictions so that they match well with the measured velocity histories at other points (point 3 through 5) as well. Points 3 and 4 have stronger turbulence and thus higher frequencies and fluctuations than at point 2, but they are smaller than at point 1. Figure 17(e) shows that the signals obtained with a moving average to match the measurement introduce a time delay. Offsetting the moving average backward in time by 0.1 seconds (half of the averaging interval) produces a signal that matches a central average of the real signal. Overall, the predictions agree well with the measurements so long as proper temporal averaging is applied according to the 0.2-second temporal filtering of the measurement method. The higher resolution of the LES model enables it to better capture the real high-frequency fluctuations of the turbulent flow in this system.

### C. Spectral Analysis

To clarify the real frequencies in velocity fluctuations, Figure 18 presents a mean-squared amplitude (MSA) power spectrum according to the formulation in Reference 10. This plot gives the distribution of energy with frequency for velocity magnitude fluctuations at points 6 and 7 (Figure 16). The general trend of increasing turbulent energy at lower frequencies is consistent with previous work.<sup>[5,10]</sup> As expected, point 6, which is close to the SEN, shows much higher energy, mainly distributed from 3 to 100 Hz, relative to point 7, which is near the narrow face. This behavior of increasing

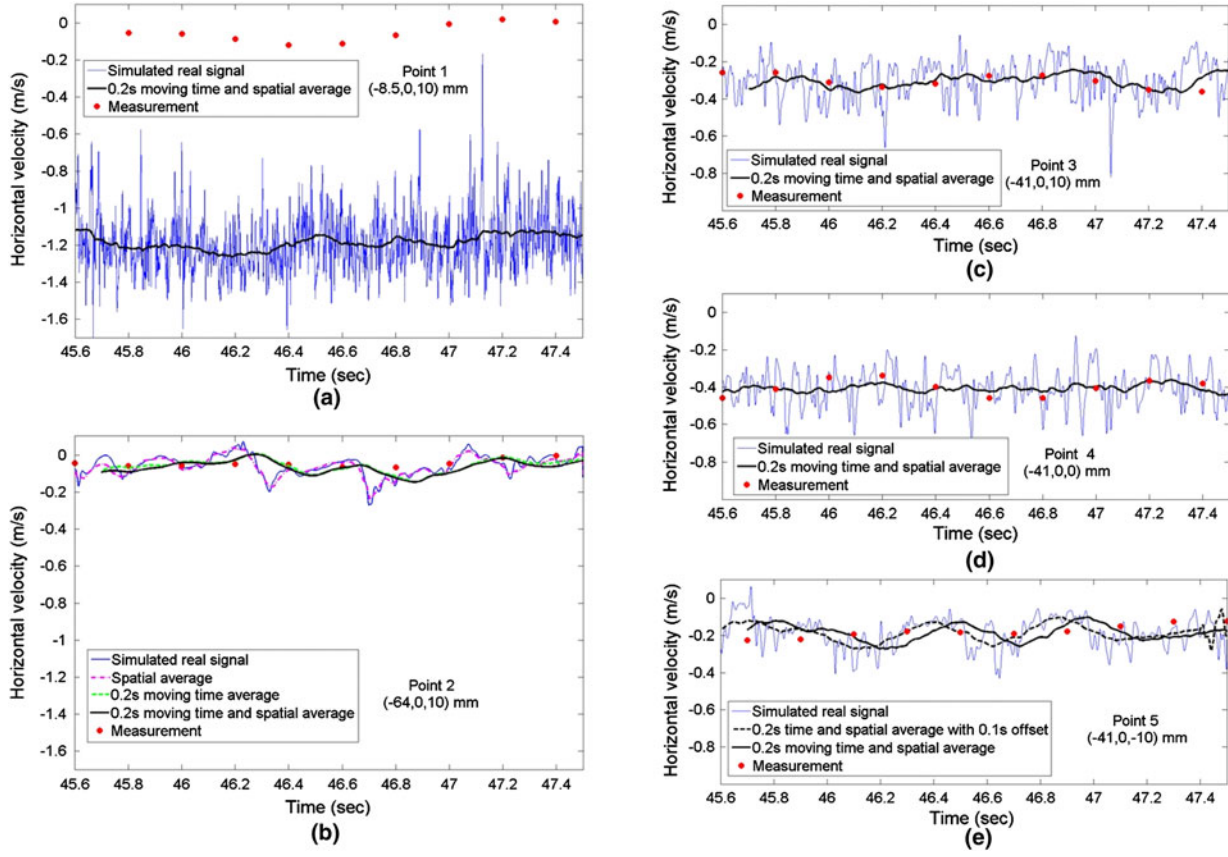


Fig. 17—Instantaneous horizontal velocity histories comparing LES-FLUENT and measurements at various points (Fig. 16) in the nozzle and mold midplane (point coordinates in mm).

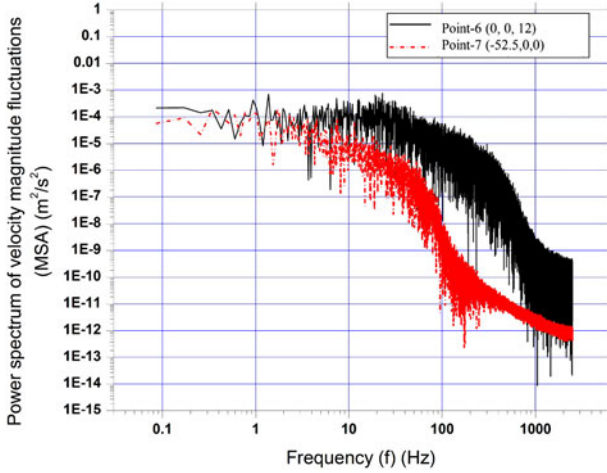


Fig. 18—Power spectrum (mean-squared amplitude) of instantaneous velocity magnitude fluctuations at two points (Fig. 16) in the nozzle and mold.

velocity fluctuations at higher frequency is consistent with the higher Reynolds number. According to the power spectrum, frequencies above 5 Hz (0.2-second period) are important. These higher frequencies represent small-scale, medium-to-low-energy turbulent eddies that cannot be captured by the measurements.

#### D. POD and Flow Variations in the Nozzle Bottom-Well

Proper orthogonal decomposition (POD) has been applied to gain deeper insight into the fundamental transient flow structures that govern the fluctuations of the velocity field, according to the formulation in References 45 and 46. This technique separates the complicated spatial and temporal-dependent fluctuations of the real 3-D transient velocity field,  $u'_z(\mathbf{x}, t)$  into a weighted sum of spatially varying characteristic modal functions by performing the following single-value decomposition (SVD)<sup>[45,46]</sup>:

$$u'_z(\mathbf{x}, t) = \sum_{k=1}^M a_k(t) \phi_k(\mathbf{x}) \quad [14]$$

where  $\phi_k(\mathbf{x})$  are orthonormal basis functions that define a particular velocity variation field and  $a_k(t)$  are the temporal coefficients. The first few terms provide a low-dimensional, visually insightful description of the real high-dimensional transient behavior. The representation naturally becomes more accurate by including more terms (larger  $M$ ).

Writing the discrete data set,  $u'_z(\mathbf{x}, t)$  in the form of a matrix  $[U'_z]$ , with  $t$  in rows and  $\mathbf{x}$  in columns, the SVD of  $[U'_z]$  is expressed as follows:

$$[U'_z] = [U][S][V]^T \quad [15]$$

where  $[U]$  and  $[V]$  are orthogonal matrices and  $[S]$  is a diagonal matrix. Defining  $[W]$  as  $[U][S]$  produces  $[U_z] = [W][V]^T$ , where the  $k$ th column of  $[W]$  is  $a_k(t)$  and the  $k$ th row of  $[V]^T$  is  $\phi_k(x)$ . The matrix  $[S]$  has diagonal elements in decreasing order of  $s_1 \geq s_2 \geq s_3 \geq s_4 \dots s_q \geq 0$ , where  $q = \min(M, N)$ ;  $s_i$ 's are called singular values and the square of each  $s$  value represents the velocity fluctuation energy in the corresponding orthogonal mode ( $k$ th row of  $V^T$ ). The  $k$ th rank approximation of  $[U_z]$  is defined as Eq. [15] with  $s_{k+1} = s_{k+2} \dots = s_q = 0$ .

To perform SVD, the velocity fluctuation data was arranged in the following matrix form:

$$[U_z] = \begin{bmatrix} \{u'_x\}_1 & \{u'_x\}_2 & \dots & \{u'_x\}_N \\ \{u'_y\}_1 & \{u'_y\}_2 & \dots & \{u'_y\}_N \\ \{u'_z\}_1 & \{u'_z\}_2 & \dots & \{u'_z\}_N \end{bmatrix} \quad [16]$$

where  $\{u'_x\}_N$ ,  $\{u'_y\}_N$ , and  $\{u'_z\}_N$  are column vectors representing a time series of three velocity components at a particular point. Matrix  $[U_z]$  has size  $M \times N$ , where  $N$  is the number of spatial velocity data points and  $M$  is the number of time instances.

In the current work, SVD was performed on the instantaneous velocity fluctuations predicted by LES-CU-FLOW at the midplane between the mold wide faces near the nozzle bottom and jet. This region was selected for POD analysis because of its strong transient behavior and large-scale fluctuations of the wobbling jets exiting the two ports. Orthogonal modes were calculated by solving Eqs. [15] and [16] with a code in MATLAB. Matrix  $[U_z]$  was formulated for POD analysis based on  $193(x-) \times 100(z-)$  spatial values for each velocity component selected for 6 seconds with a time interval of 0.006 seconds (total  $N = 19,300 \times 3 = 57,900$ ,  $M = 1000$ ).

Figure 19 presents contours of the most significant velocity variation components in the first four orthogonal

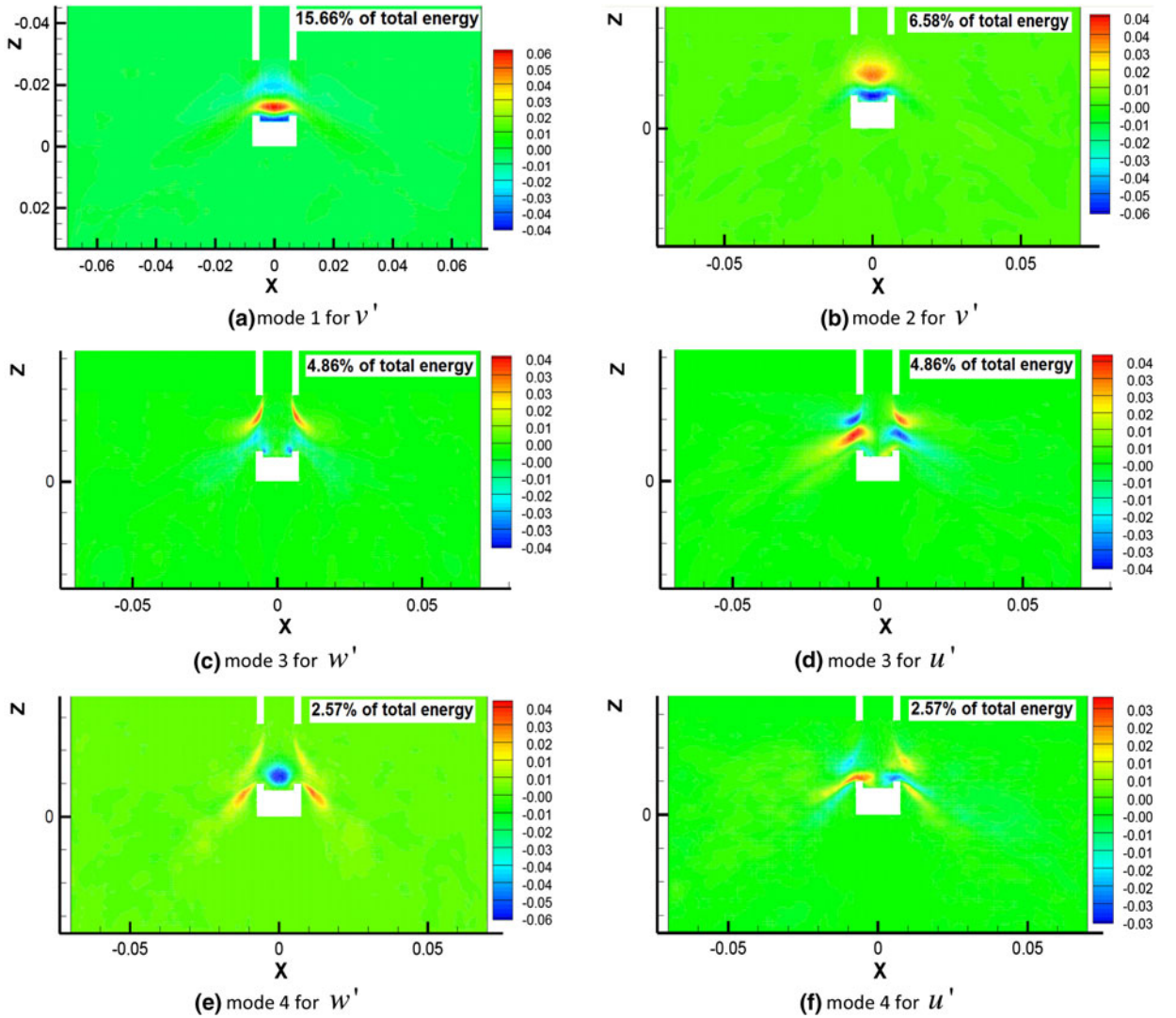


Fig. 19—First four POD modes (containing ~30 pct of total energy) showing different velocity component fluctuations ( $u'$ ,  $v'$ , or  $w'$ ).



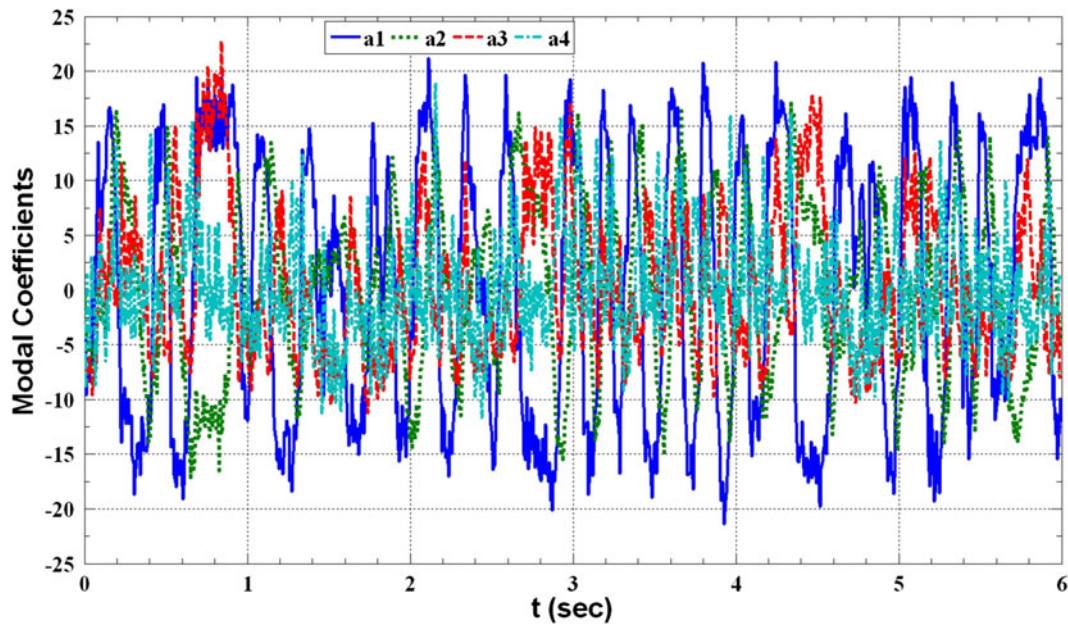


Fig. 20—POD modal coefficients (or modal contributions).

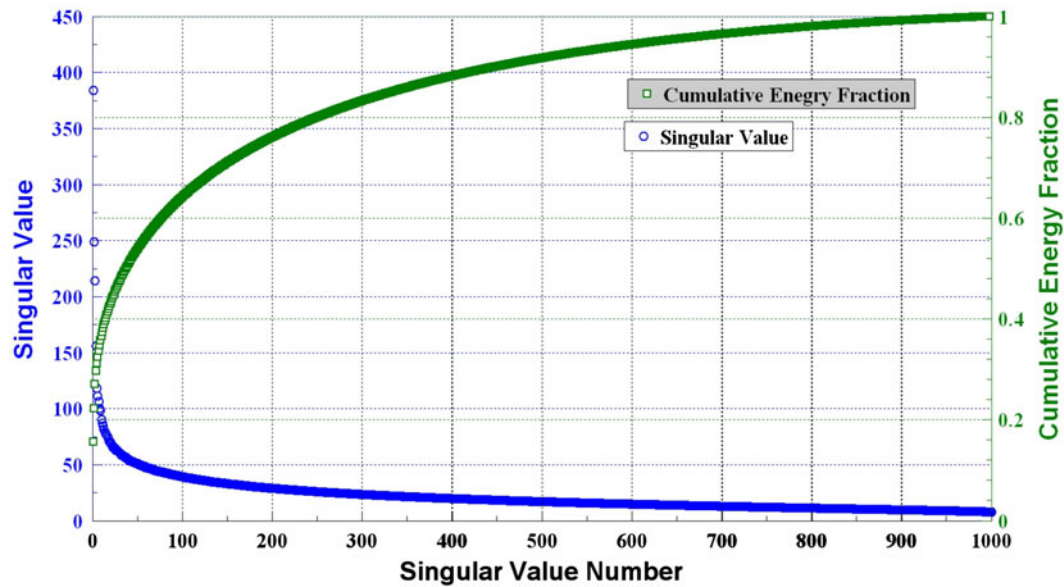


Fig. 21—Singular values and cumulative energy in different POD modes of velocity fluctuations ( $\bar{u}'$ ).

modes, which contain ~30 pct of the fluctuation energy. In the first two modes (containing ~22 pct of the energy), the only significant component  $v'$  shows the alternating swirling flow in the well of the nozzle. In modes 3 and 4, the only significant components are the horizontal and vertical velocity variations ( $u'$  and  $w'$ ), which are associated with up-down jet wobbling.

Figure 20 presents the temporal coefficients of these modes and shows a positive-negative oscillatory behavior that indicates periodic switching of the direction of these modes. The singular values, which are a measure of the energy in each mode, are presented together with

the cumulative energy fraction in Figure 21. The singular values reduce exponentially in their significance with increasing mode number. The first 400 modes contain ~88 pct of the total fluctuation energy.

The importance of different modes can be visualized by reconstructing instantaneous velocity profiles from their singular values. Four such reduced rank approximations of the fields are given in Figure 22. Figure 22(a) presents the time average of 6 seconds data and Figure 22(b) shows the original instantaneous velocity profile at  $t = 0$  seconds. The rank-400 approximation, with 88 pct of the energy, approximates the original

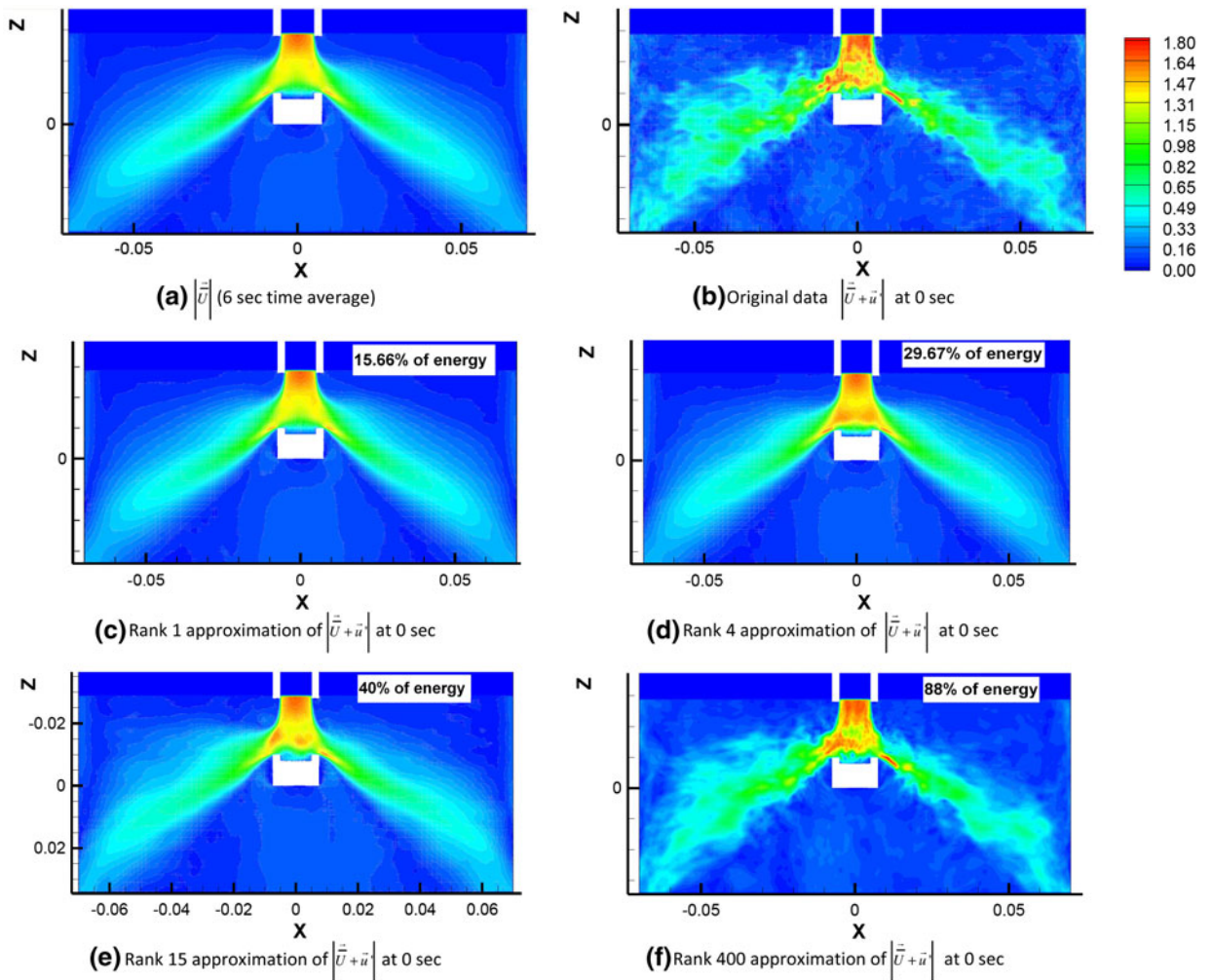


Fig. 22—POD reconstructions of velocity magnitude in mold centerline showing contours of (a) time-average and (b) an instantaneous snapshot calculated by LES CU-FLOW at 0 s compared with (c) through (f) four approximations of the same snapshot using different ranks.

snapshot reasonably well. The rank-15 approximation, with 40 pct of energy, captures much of the nozzle velocity fluctuations but misses most of the turbulent scales contained in the jet. This finding indicates that the turbulent flow in this mold is complex and contains important contributions from many different modes. This is likely a good thing for stabilizing the flow and avoiding quality problems.

The nozzle well swirl effects associated with the most-important first and second modes can be understood better with the help of instantaneous velocities in the well of a nozzle. Figure 23 presents instantaneous and time-average velocity vectors and contours at the midplane slice between narrow faces, looking into a nozzle port. As shown in Figure 23(c), the behavior of  $v$  in the first mode is caused by swirl in the SEN bottom well and has 15.66 pct of the total energy. The swirl direction of rotation periodically switches, which causes corresponding alternation of the  $v$  contours in Figures 19(a) and 23(c). This switch is also observed in the  $v'v'$  peaks in Figure 14(c). The alternating swirl also causes the strongest vertical flow to alternate between the front and back walls of the nozzle, as observed in the

$\overline{w'w'}$  peaks in Figure 14(a) and in  $w$  in Figure 23(b). The temporal coefficient of the first mode in Figure 20 suggests that the switching frequency is  $\sim 3$  Hz. It is interesting to note that these continuously alternating rolls are not apparent in the symmetrical time average of this flow field, shown in Figure 23(d). A spectral analysis on  $v'$  in Figure 24 of a node in the nozzle bottom region revealed the dominance of  $\sim 3$ - to 4-Hz frequencies, which is consistent with the frequencies of the temporal coefficients of the first mode. This revelation of swirl with periodic switching illustrates the power of the POD analysis, which matches and quantifies previous observations of the transient flow structures in the nozzle bottom well.<sup>[3]</sup>

Another interesting mode is the up-and-down oscillation of the jet exiting the nozzle, which is manifested in  $u'$  and  $w'$  of mode 3, which is shown in Figures 19(c) and (d). The temporal coefficient of mode 3 in Figure 20 quantifies the period of this wobbling to be  $\sim 3$  to 5 Hz, which means it is likely related to the alternating swirl directions, as previously proposed.<sup>[3]</sup> This transient flow behavior also has been observed in previous work in which it was labeled “stair-step wobbling.”<sup>[8]</sup> To control



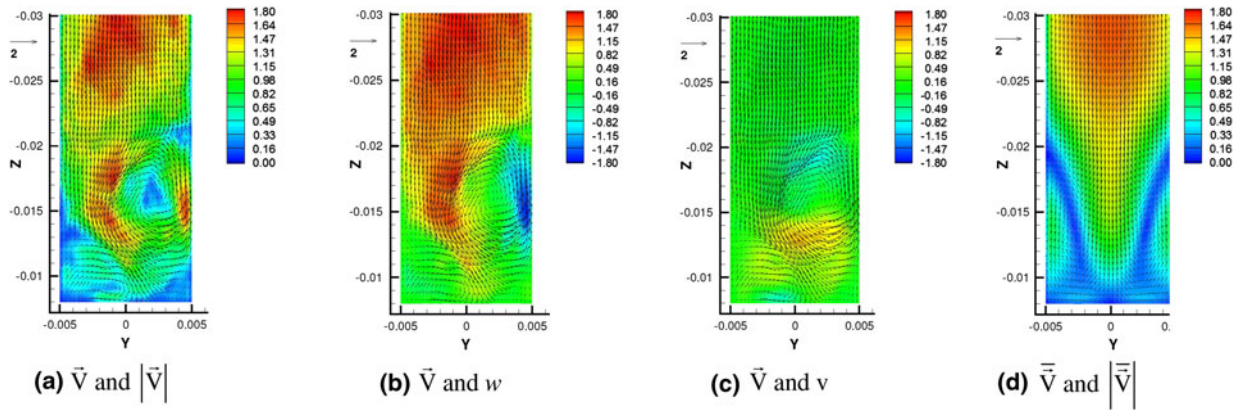


Fig. 23—Flow pattern in the SEN bottom well midplane, showing an instantaneous velocity vector snapshot colored with contours of (a) velocity magnitude, (b) vertical velocity, and (c) horizontal velocity. (d) Time-average velocity vectors and velocity magnitude contours.

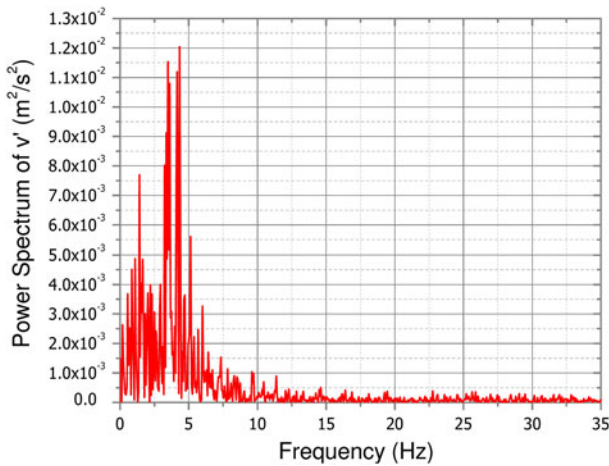


Fig. 24—Power spectrum (MSA) of wide face normal velocity fluctuations at SEN nozzle bottom center at 95 mm below mold top.

mold turbulence, it seems important to control the first swirling mode, which sends turbulence to the mold in the form of  $u'$  and  $w'$ .

To identify additional modes in other planes requires extension of the POD analysis to complete 3-D instantaneous flow fields, which is beyond the scope of the current work. Even in two dimensions, however, this work shows the capability of POD analysis to illustrate and quantify transient structures in a new way, making it another powerful tool for the analysis of LES velocity results.

## VIII. SUMMARY AND CONCLUSIONS

In this work, computational models are combined with measurements in a liquid GaInSn model to investigate turbulent flow in the nozzle and mold of a typical continuous casting process. This work also evaluates the performance of five different computational models, including two steady RANS models, “filtered” URANS, LES with FLUENT, and LES with an in-house GPU-based CFD code (CU-FLOW).

LES predictions of time-averaged horizontal velocity match well with the measurements, except where limitations in the measurements give unreasonably lower values close to the SEN and narrow face walls. Time and spatial averaging of the LES predictions to match the experimental resolution of <5 Hz produces transient velocity histories that match closely with the measurements. Spectral analysis of the LES predictions confirms a large range of velocity fluctuation frequencies near the SEN (up to ~300 Hz, for two orders of magnitude drop in energy) and close to narrow face (up to ~30 Hz, for two orders of magnitude drop in energy). The fluctuation energy generally drops with distance from the nozzle, especially at the higher frequencies.

LES-CU-FLOW was the best model, with better accuracy than LES-FLUENT, owing to its higher resolution with an approximately five times finer mesh, and tremendously better computational efficiency, owing to its better numerics and use of a GPU methodology. The “filtered” URANS model performed between LES and steady RANS, missing the high-frequency fluctuations but capturing the long-time variations associated with large structures. The RANS models matched time-averaged velocity closely in the nozzle but greatly underpredicted turbulence exiting the ports. This caused mismatches in the mold, especially with turbulence, so caution is needed when using steady RANS models. Among steady RANS models, SKE performed better than RKE.

The flow pattern is a stable, classic, double-roll flow pattern, controlled by the strong turbulent nature of the flow structures in the bottom of the nozzle. The resolved Reynolds stresses and TKE show strong fluctuations in vertical velocity ( $\overline{w'w'}$ ) and velocity of normal to wide faces ( $\overline{v'v'}$ ) associated with alternating directions of swirl in the bottom of the nozzle, and with wobbling of the jet in the mold. A POD analysis also reveals that the strongest transient flow structures are associated with nozzle bottom swirl and jet wobbling. The modes associated with this swirl contained 22 pct of the fluctuation energy. To control turbulence in the mold, it is important to control these modes.



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