



## Open Archive TOULOUSE Archive Ouverte (OATAO)

OATAO is an open access repository that collects the work of Toulouse researchers and makes it freely available over the web where possible.

This is an author-deposited version published in : <http://oatao.univ-toulouse.fr/>  
Eprints ID : 18145

**To link to this article** : DOI: 10.1016/j.minpro.2016.07.002  
URL : <http://dx.doi.org/10.1016/j.minpro.2016.07.002>

**To cite this version** : Dubey, R.K. and Climent, Éric and Banerjee, Chandranath and Majumder, Arun Kumar *Performance monitoring of a hydrocyclone based on underflow discharge angle*. (2016) International Journal of Mineral Processing, vol. 154. pp. 41-52. ISSN 0301-7516

Any correspondence concerning this service should be sent to the repository administrator: [staff-oatao@listes-diff.inp-toulouse.fr](mailto:staff-oatao@listes-diff.inp-toulouse.fr)

# Performance monitoring of a hydrocyclone based on underflow discharge angle

R.K. Dubey<sup>a</sup>, Eric Climent<sup>b</sup>, C. Banerjee<sup>a</sup>, A.K. Majumder<sup>a,\*</sup>

<sup>a</sup> Department of Mining Engineering, Indian Institute of Technology Kharagpur, Kharagpur – 721302, India

<sup>b</sup> Institut de Mécanique des Fluides de Toulouse (IMFT), Université de Toulouse, CNRS-INPT-UPS, Toulouse, France

## A B S T R A C T

The performance of a hydrocyclone as a separation device is never perfect and rigorous research efforts are still continuing along various directions towards achieving optimum solutions. The modus operandi of performance optimization is important for quick and non-invasive monitoring of hydrocyclone performance. Therefore, in the present study, an application potential of spray angle as a performance monitoring tool has been explored to investigate the operation state of a hydrocyclone. In this context, phenomenological features of spray discharge over a wide range of injection pressure and feed solid concentration have been investigated. The emphasis of the present study is to verse the amendment of the hydrocyclone operational state with the corresponding change in underflow discharge pattern. The pattern of the underflow discharge profile was captured using a digital camera and analyzed based on an image processing algorithm to detect the discharge angle under different operating and design conditions. Stability and reproducibility of the spray angle at fixed operating condition have also been confirmed. Subsequent analysis shows that the spray angle is sensitive to variations of operating and design variables. More specifically the effect of feed slurry concentration has been characterized and is of major importance for the transition to roping. On this basis, an attempt has also been made to develop an empirical correlation based on experimental data. The developed correlation shows that the discharge angle could possibly be used as a reliable tool to monitor hydrocyclone performance.

### Keywords:

Hydrocyclones

Spray angle

Image analysis

Performance monitoring

## 1. Introduction

It has been long advocated that spray angle can be used as a performance monitoring tool for hydrocyclone. Various works have also been carried out in the past which indicate the significance of using underflow discharge pattern as one of the most important process control technique as an alternative to various empirical (Marlow, 1973; Lynch and Rao, 1975; Plitt, 1976; Nageswararao, 1978; Castro, 1990) and theoretical (Hsieh and Rajamani, 1991; Barrientos and Concha, 1992; Monredon et al., 1992) modeling techniques, which suffers from inherent limitations of their own (Neesse, Schneider, Dueck, et al., 2004a; Neesse, Schneider, Golyk and Tiefel, 2004b; Petersen et al., 1996; Van Deventer et al., 2003). Industrial application of using spray angle as an indicator is also advantageous as the spray pattern is easily visible and spigot diameter is the only design variable which can be easily replaced.

Using the underflow discharge angle as an indicator for monitoring the performance of a hydrocyclone, it was imperative to convert the discharge pattern from the underflow of a hydrocyclone in a quantifiable parameter. Various attempts were made in the past to achieve similar

conclusions using various mathematical, theoretical and visualization techniques. Van Deventer et al. (2003) and Neesse, Schneider, Dueck, et al. (2004a) proposed that the flow geometry of the spray discharge arises from velocity pattern at the outlet orifice of the underflow. To calculate the spray angle, simulated values of the radial, axial and azimuthal velocities at underflow exit were used. An attempt was made to develop a tool to control underflow discharge using a two-dimensional electrical impedance tomography (Williams et al., 1997). A technique, based on the measurement of the pressure exerted by the underflow to monitor the spray angle was proposed (Viljoen, 1993). Petersen et al. (1996) and Van Vuuren et al. (2011) also made attempts to measure spray angles and spray width respectively using image processing techniques. Spray angle is an important factor to be considered when investigating spray shape in a pressure swirl atomizer. It was calculated using 'Image J software' and was further linked with design and operating variables (Rashid et al., 2012). However, none of the above-mentioned techniques have found the day of light in industrial application probably due to lack of versatility and huge financial aspect associated. The method we propose, has more prospects for industrial implementation due to its limited cost and the technology required is simple.

An image processing based algorithm on MATLAB™ platform to quantify the discharge profile in terms of spray angle in a 2-inch Tega hydrocyclone running with water only was demonstrated by

\* Corresponding author.

E-mail address: akm@mining.iitkgp.ernet.in (A.K. Majumder).

## Nomenclature

|               |   |
|---------------|---|
| $A$           | level of significance                                     |
| $A_c$         | Effective cross sectional area for underflow ( $m^2$ )    |
| $A_i$         | Feed inlet area ( $m^2$ )                                 |
| $B/P$         | Bypass flow   |
| $d$           | Equivalent diameter of inlet (m)                          |
| $d_a$         | Air core diameter in the spigot region (m)                |
| $D_o$         | Vortex finder diameter (m)                                |
| $D_u$         | Spigot diameter (m)                                       |
| $k$           | No of independent variable                                |
| $K_{a,b,c,d}$ | Constants   |
| $n$           | No. of observation for each $k$                           |
| $P_g$         | Pressure gauge  |
| $Q_i$         | Feed inlet volumetric flow rate ( $m^3.s^{-1}$ )          |
| $Q_u$         | Underflow volumetric flow rate ( $m^3.s^{-1}$ )           |
| $R_s$         | Fraction of feed solid to underflow                       |
| $R_f$         | Fraction of feed water to underflow                       |
| $R_v$         | Volumetric recovery of slurry to underflow w.r.t. feed    |
| $Re_i$        | Inlet Reynolds number                                     |
| $U$           | Overall head velocity ( $m.s^{-1}$ )                      |
| $u$           | Velocity component in axial direction ( $m.s^{-1}$ )      |
| $v$           | Velocity component in radial direction ( $m.s^{-1}$ )     |
| $v_i$         | Feed inlet velocity ( $m.s^{-1}$ )                        |
| $V_1$         | Feed inlet pressure control valve                         |
| $V_2$         | Bypass valve  |
| $w$           | Velocity component in tangential direction ( $m.s^{-1}$ ) |
| $x$           | Axial velocity/overall velocity at the outlet             |
| $y$           | Angular velocity/(outlet radius X overall head velocity)  |
| $z$           | Air core radius/outlet radius at the outlet               |
| <br>          |   |
| Greek letters |   |
| $\theta$      | Underflow discharge spray angle (degree)                  |
| $\lambda$     | Ratio of underflow pulp density to feed pulp density      |
| $\mu$         | Viscosity of the inlet feed slurry (Pa.s) at 30 °C        |
| $\mu_0$       | Viscosity of water (Pa.s) at 30 °C                        |
| $\mu_u$       | Viscosity of underflow slurry (Pa.s) at 30 °C             |
| $\rho$        | Density of the inlet feed ( $kg/m^3$ )                    |
| $\emptyset$   | Volume fraction solids in feed                            |

Mazumdar et al. (2014). It was established that spray angle is stable and reproducible at a given operating condition to be used as an indicator for performance monitoring and control. It was further correlated and an empirical model was developed with variables affecting the formation of spray angle. It was concluded that the spray angle varies with the change in operating and design parameters with water only condition.

In view of the above, a systematical analysis of underflow spray angle as a performance monitoring tool in case of hydrocyclone running with slurry is investigated. Hence, an attempt has been made in the theoretical understanding of the hydrodynamics of spray formation and to confirm adaptability of the algorithm as described by Mazumdar et al. (2014) in the case of hydrocyclone running with slurry. The image processing based technique was then adopted to measure the underflow discharge angle of a hydrocyclone treating various concentrations of fine silica slurries. For fixed operating conditions, the spray stability has been demonstrated to establish the steady nature of the spray angle in Section 3. The change in the spray angle at different operating conditions is correlated with the process and design variables of the hydrocyclone affecting the spray formation. An empirical correlation has also been derived based on multivariate regression analysis and relevant statistical analysis has been discussed in brief to verify the developed model. In the end, the reliability of the empirical model developed has also been verified with random experimental data in Section 5. The detailed description of these forms the subject matter of this article.

## 2. Hydrodynamics of spray formation

Before going into the details of the experimental methodology and analogous observations, it is necessary to discuss in brief the hydrodynamic aspects of spray formation.

Mechanism of spray formation through pressure nozzles is a very popular and developed research topic in the fluid mechanics domain. The first atomizer spray angle equation was developed by Taylor, 1948 (Van Deventer et al., 2003),

$$\cos\theta = \frac{u}{U} = x + \frac{\sqrt{2}yz^2}{(1-z^2)^{3/2}} \left[ \frac{1}{2} \left( \frac{1}{z^2} - 1 \right) + \ln(z) \right] \quad (1)$$

All parameters of this relation are defined in the nomenclature section. It has been inherently identified that the separation characteristics in a hydrocyclone are basically governed by the centrifugal action. In a hydrocyclone, fluid rotates about an axis and forms a spiral vortex which moves in the downward direction and near the spigot the fluid changes its direction and forms an inner spiral which moves in the upward direction along the axis of the cyclone. The characteristics of the vortex formed inside the hydrocyclone are a compound vortex combination of free and forced vortex also known as Rankine vortex. This consists of a rotational vortex core with constant angular velocity encompassed by an irrotational vortex.

The geometric features of the underflow discharge profile are essentially dependent on the patterns of exit velocity components. Two major features, the axial and azimuthal velocities are responsible in contributing to the resulting spray formation. However, in the spray condition the azimuthal velocity is in a direction perpendicular to the outlet. Visual inspection of hydrocyclone operation reveals that the pulp flow at the underflow exit in a predominantly tangential orientation (Van Deventer et al., 2003). At the spigot exit where spray forms the axial velocity is perpendicular to the tangential component.

The spray angle  $\theta$  was mathematically described by an equation proposed by Neesse, Schneider, Dueck, et al. (2004a),

$$\theta = \arctan \frac{w}{u} = \arctan \left[ \frac{\rho_m D_u / 2}{\mu_m u} w^2 \right] \quad (2)$$

In simpler terms, hydrocyclone separation process is accomplished with the highly turbulent swirling flow generated by the inlet fluid at high Reynolds number. As the fluid comes out of the spigot in the form of underflow discharge, particles compete with the amount of centrifugal force generated at the exit (azimuthal velocity), the axial flow and gravitational force. The lighter/smaller particles tend to follow the path dictated by swirling water, whereas the heavier/coarser particles are dominated by the gravitational force. Therefore, particle size distribution reporting to the underflow also affects the spray formation phenomenon. Another factor is the amount of water and solid reporting, also called underflow slurry density. Lesser water/more solid fractions will increase the dominance of gravitational force and spray will tend to follow the rope like discharge profile, whereas, in case of more water/less solid, swirling intensity will dominate resulting in a spray like discharge (umbrella shape). For this transition from spray like discharge to roping both the slurry density and viscosity (mixture equivalent viscosity) are important. This has been observed both in experiments and numerical simulations in the dense regime (Davailles et al., 2012). Geometric parameters as the diameter of the vortex and spigot will control the amount of water/solid reporting to underflow in combination with other operating and geometric parameters. Therefore, the underflow discharge pattern of a hydrocyclone is inherently associated with the intensity of fluid flow quantified in terms of inlets Reynolds number; feed solid concentration as well as the geometric configuration of the hydrocyclone. The detail dependency of each of

**Table 1**  
Fixed parameters used in experiments.

| Fixed parameter   | Value       |
|---|-------------|
| Hydrocyclone diameter (mm)                                    | 50.8        |
| Cone angle (degree)   | 7           |
| Inlet area (mm <sup>2</sup> )                                 | 9×6         |
| Feed: Silica Sand (d <sub>50</sub> and d <sub>90</sub> in μm) | 15 and 35.5 |

**Table 2**  
Design and operating variables (experimental study).

| Du(m) | Do(m)  | FIP(N/m <sup>2</sup> ) | Feed conc. (%w/w) |
|-------|--------|------------------------|-------------------|
| 0.008 | 0.0032 | 68948–344740           | 1–7               |
| 0.008 | 0.0045 |                        | 1–12.5            |
| 0.011 | 0.0045 |                        | 1–12.5            |
| 0.011 | 0.0064 |                        | 1–20              |
| 0.014 | 0.0045 |                        | 1–5               |
| 0.014 | 0.0064 |                        | 1–10              |

**Table 3**  
Size distribution of the particles in the feed.

| Diameter(μm) | Particle percentage |
|--------------|---------------------|
| >45          | 3.45                |
| 35–45        | 6.64                |
| 30–35        | 4.65                |
| 25–30        | 10.85               |
| 20–25        | 11.23               |
| 15–20        | 10.34               |
| 10–15        | 16.88               |
| 5–10         | 16.93               |
| <5           | 19.03               |
| Total        | 100.00              |

the above controlling parameters on the spray formation is explained in subsequent sections.

However, before exploring the above-mentioned parameters, it is important to establish the competency of the experimental method adopted and whether the spray angle remains stable and is reproducible

under a fixed operating condition to be used as a performance monitoring tool.

### 3. Materials and methods

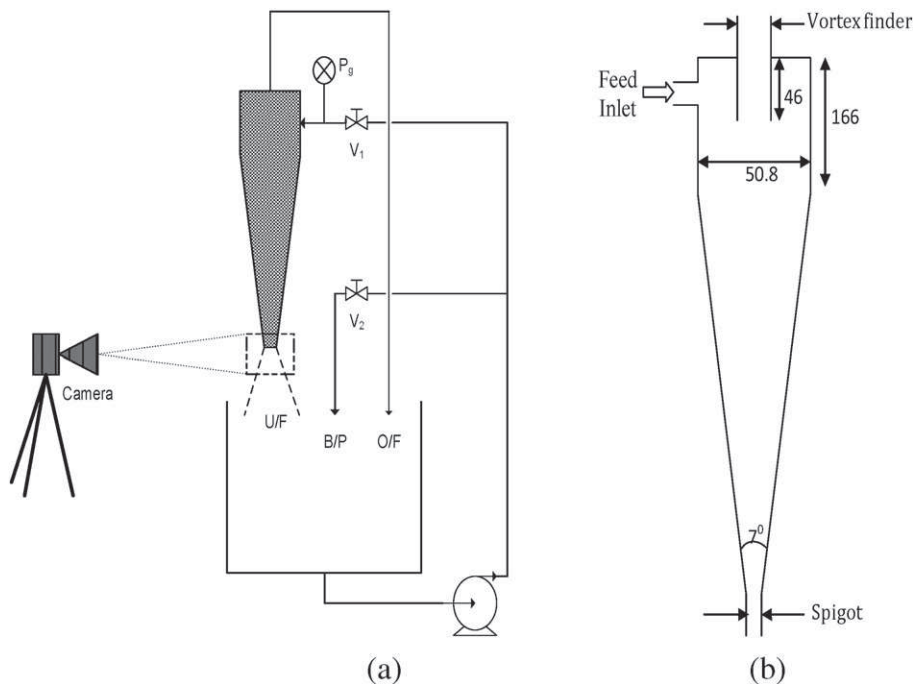
#### 3.1. Experimental test rig

A closed circuit 2-inch Tega hydrocyclone having 7° cone angle test rig consisting of pump and sump assembly was used for generating the experimental data set. Before carrying out an experiment, pre-determined quantities of feed silica sand (mono-density, S.G. 2.56) and water were mixed in the slurry tank to maintain the desired feed slurry concentration. Slurry feed rate to the separator and the pressure at the inlet were adjusted using the bypass valve. The fixed parameters (for the present study) are shown in Table 1 and the range of variables used in experiments have been illustrated in Table 2. The particle size distribution is given in Table 3.

The sketch of the experimental setup is illustrated in Fig. 1(a) and the design dimension of the hydrocyclone is shown in the Fig. 1(b). As we are concentrating on underflow discharge pattern, so, any type of vibration in test rig or/and due to the internal flow pattern affect the angle measurement precision. Vibrations are inherent to hydrocyclone internal flow structure due to the presence of highly turbulent vortex dynamics, particle impact, air core instabilities and discharge oscillations (Neesse and Dueck, 2007; Sripriya et al., 2007). Special care was taken to minimize vibrations of the test rig which is permanently mounted on the floor and rubber gaskets are used between the bolting system (pump and motor with test rig). The top and bottom sections of the hydrocyclone body were properly clamped.

#### 3.2. Experimental procedure

A series of experiments were conducted in an attempt to characterize the trends of spray angle with various operating and design variables and their mutual responses at different experimental conditions as mentioned in Tables 1 and 2. One variable (other fixed) at a time experimentation technique is adopted for generating required data. Repeat experiments are also carried out at arbitrarily selected operating



**Fig. 1.** (a) Schematic diagram of experimental set-up (b) hydrocyclone design dimension (in mm).

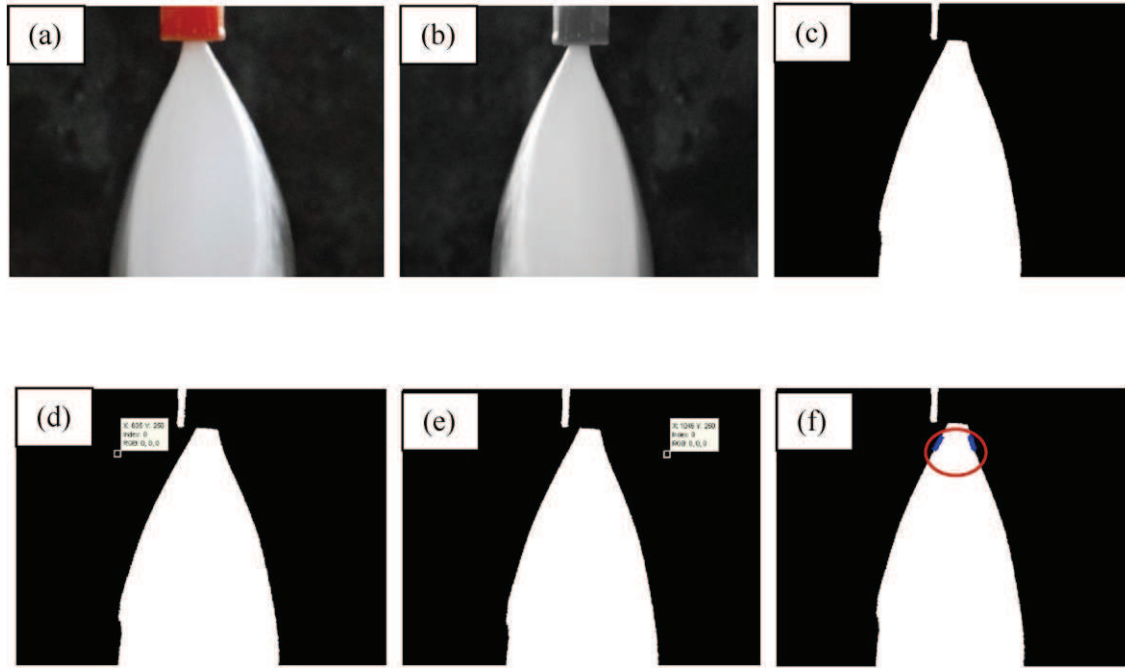


Fig. 2. Various steps involved to measure the UF discharge angle (a) RGB image (b) gray scale image (c) binary image (d) L.H.S coordinate (e) R.H.S coordinate (f) traced boundary.

conditions. Timed samples of underflow and overflow were also taken. Thereafter, to remove the water from sampled slurry, filtration was carried out using pressure filter (FLSmidth, R 101833). Subsequently to completely remove the moisture from the filtered sample, hot air oven was used and samples were dried for 1–2 h at 110 °C. Finally, employing MALVERN Laser particle size analyzer, the size distribution of underflow, as well as overflow sample materials, were estimated. The temperature of feed slurry was maintained between 30 °C and 35 °C during the experimental tests. The above-mentioned procedure was repeated for each set of experiment.

The algorithm as developed by Mazumdar et al. (2014) was initially tested on hydrocyclone running with water only. The accuracy and robustness of the algorithm were established in the case of water. Therefore, an attempt was made to validate the usability of the mentioned algorithm in case of hydrocyclone running at various feed solid concentrations. To do so, images of the underflow spray profile were captured using a digital camera (Sony-DSC HX-300, 50× zoom, 20.4 MP). The position of the camera was kept perpendicular to the projection of spray at

the same level. The spray angle was measured from captured image based on edge detection technique using image processing algorithm developed on the MATLAB™ platform. The detail methodology of the image reconstruction and post-processing techniques has been reported elsewhere (Mazumdar et al., 2014), however, a brief overview is given in the next sub-section.

The camera was fixed to a stationary system, separate from the influence of equipment vibrations. At the time of capturing the image of underflow discharge shape, the camera was placed at a fixed distance (~2 m) from the test rig to avoid damage to the lens of the camera. This has also a benefit for image processing because parallax error is reduced. At larger distances, the images tend to blur and proper distinction of the pixel could not be achieved, which is very important for processing the image. A contrast background was used while capturing the image of the profile. This contrast background helped in creating a marked pixel intensity difference and assisted in recognizing the boundaries of the spray. Using this contrast background one would ensure that irrespective of the color of the slurry, processing of the image would be possible. Due to the vibrational effect (although minimized), any kind of displacement and/or rotation in underflow discharge pattern were handled through image registration during image processing. Ten images were taken at each operating condition at a rate of one frame per second to calculate the standard deviation in the developed measurement technique. The algorithm was found to be working efficiently in the case of slurry, as well. The spray angle calculated was statistically reproducible and evolved with changing operating conditions.

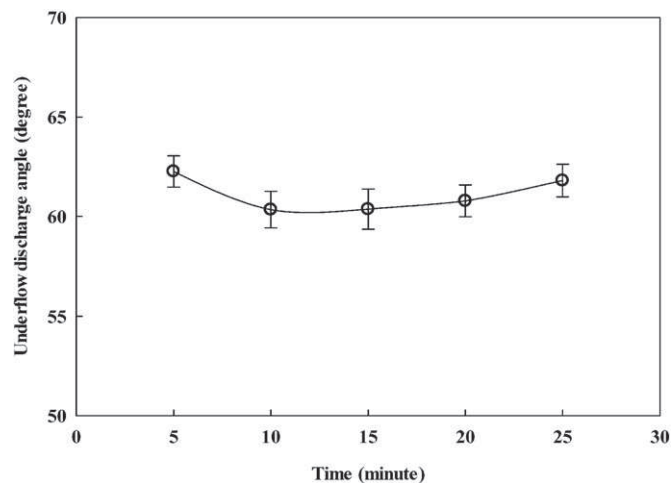


Fig. 3. Variation of spray angle at different time intervals at a fixed operating condition (standard deviations are indicated by vertical error bars).

Table 4

Error estimation within measured spray angle with water and slurry using  $Do = 0.011$  m and  $Du = 0.0064$  m.

| UF discharge angle |            |                    |
|--------------------|------------|--------------------|
| Time(min)          | Water only | Slurry (5% by wt.) |
| 5                  | 65.987     | 62.267             |
| 10                 | 64.998     | 60.343             |
| 15                 | 63.893     | 60.371             |
| 20                 | 62.359     | 60.784             |
| 25                 | 65.898     | 61.811             |
| Avg.               | 64.627     | 61.115             |
| S.D.               | 1.523      | 0.876              |

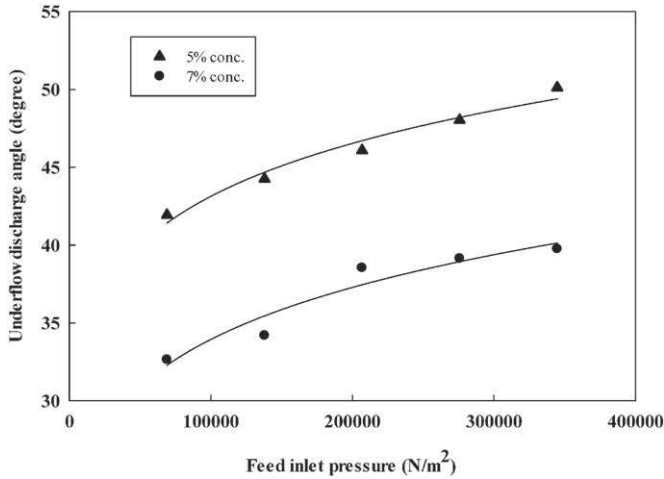


Fig. 4. Effect of feed inlet pressure on spray angle using  $D_o = 0.011$  m and  $D_u = 0.0045$  m.

### 3.2.1. Image reconstruction and post processing

A digital image, as captured by the camera (RGB image, Fig. 2(a)) was converted into a grayscale image (Fig. 2(b)) to reduce the amount of memory required and processing time. Subsequently, the converted grayscale image has pixel intensity between 0 and 255 (for an eight-bit image). The grayscale image is hence converted to a binary image (Fig. 2(c)) using a global threshold value. The global threshold value is automatically generated by MATLAB™ using the method described by Otsu (1979). This thresholding helps in binarizing the image into pixel intensity values of either 0 or 1. The contrast background helps in segmenting the region of interest and essentially distinguishes the spray boundary from the background. Each side of the region of interest, X, Y coordinates (Fig. 2(d, e)) are selected and loop traversed towards the region of interest. As soon as the pixel intensity value is changed from 0 to 1, the boundary is detected. Next by tracing the boundary of the spray from both sides (using the 'bwtraceboundary' function), a vector equation is developed from the coordinates of the traced pixel of the boundary (Fig. 2(f)). The dot product of the two vector equations gives the spray angle. The average of 10 measured angle was considered the specific spray angle at a particular design and operating condition. This above procedure was repeated for each set of experimental condition to get the spray angle.

### 3.2.2. Spray stability

To use, spray angle as an indicator of performance in hydrocyclone, it is inarguably important to establish stability and reproducibility within

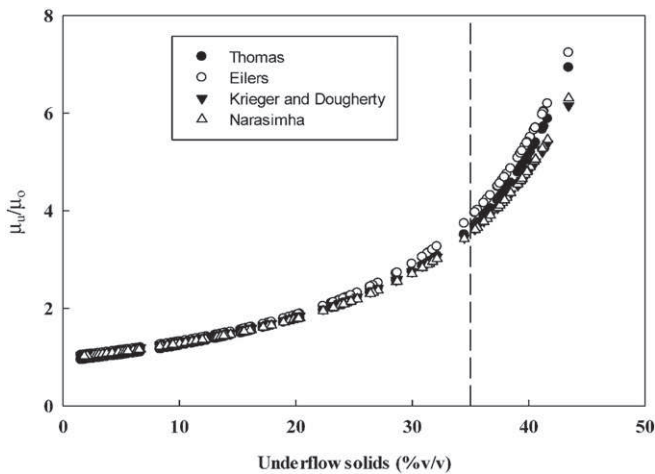


Fig. 5. Underflow enhanced viscosity comparison within 4 different viscosity model.

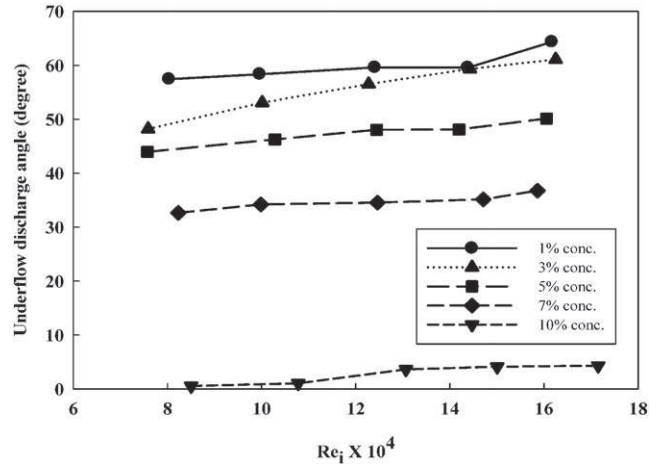


Fig. 6. Effect of feed inlet Re on spray angle using  $D_o = 0.011$  m and  $D_u = 0.0045$  m.

statistically allowable range at a given operating condition. To establish the validity of above-mentioned assumption, the test rig was allowed to run for a prolonged duration of time (25 min) keeping all the design and operating parameters fixed (at a fixed flow rate). At every interval of 5 min, 10 images were taken at one frame per second. The average of these 10 spray angles (for every 5-min intervals) was calculated and

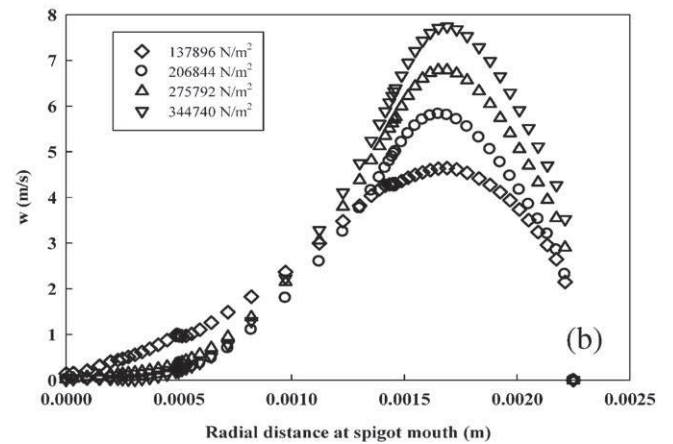
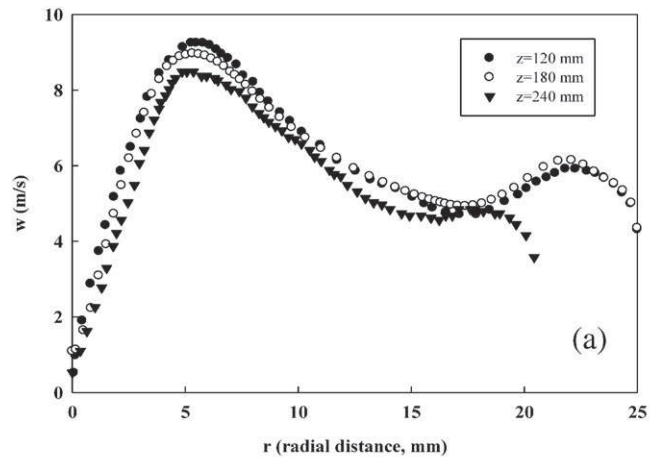


Fig. 7. Azimuthal velocity profile in hydrocyclone (a) at 3 different axial heights and (b) 4 different feed inlet pressures with  $D_o = 0.011$  m and  $D_u = 0.0045$  m (water only condition).

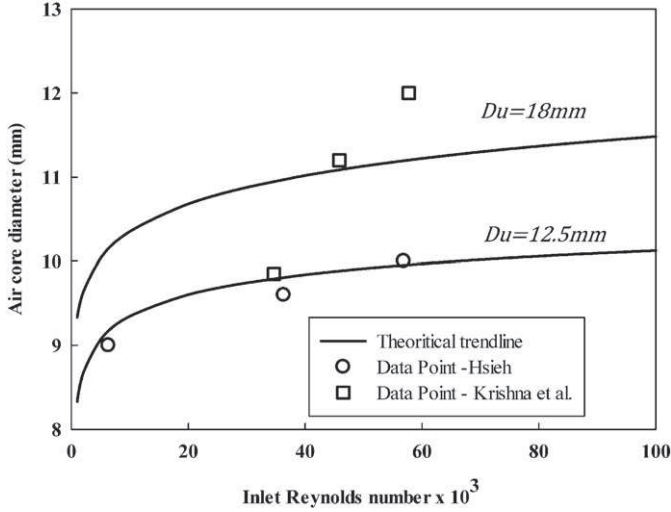


Fig. 8. Comparison of the theoretical model (Eq. (10)) with the data available from literature.

plotted against time along with standard deviation associated (shown in Fig. 3).

It may be observed from the Fig. 3 that the standard deviation of the measured angle varied below  $\pm 2^\circ$  at 95% confidence interval in all cases. This establishes that spray angle remains constant at a given operating condition which is suggestive of using it as a reliable indicator.

Further, a comparable study has been done between measured spray angle error with water only condition and with slurry. From Table 4, it is quantified that the S.D. within measured angle is higher with water only condition. The probable reason behind this can be explained in the following manner.

The shape of the underflow discharge pattern is highly dependent on the air core morphological feature. It is a common knowledge that interfacial surface tension force has the ability to preserve an air body within a liquid medium. However, for single phase fluid pertains to a condition with high magnitude of velocities. As a consequence, the turbulent fluctuation is so prominent that the air core appears to be highly vibrant. Because of dancing nature of air core (Narasimha et al., 2006), the underflow discharge pattern exhibits a transient fluctuation in the spray angle. This is a well-established phenomenon of swirling flow hydrodynamics (Som and Mukherjee, 1980).

The swirling flow characteristic inside a hydrocyclone can be approximated to solid body rotation (Kundu and Cohen, 2009). The tangential velocity, which drives the separation inside the hydrocyclone, is strongly affected by the feed solid concentration (Davailles et al., 2012). This leads to the diminishing effect of centrifugal force with respect to the viscous effects. As a result, the flow induced oscillation of air core gradually diminishes with an increase in mixture viscosity (due to the presence of solid). Therefore, we observed that the temporal stability of the spray discharge is appearing to be more consistent and the relative standard deviation is comparatively small with respect to water only condition.

Table 5  
Flow conditions at the spigot for water only ( $D_0 = 0.011$  m and  $D_u = 0.0045$  m).

| Inlet Reynolds number | Froude number | Calculated angle | % error with measurements |
|-----------------------|---------------|------------------|---------------------------|
| 65674                 | 665           | 50.0             | 6.8                       |
| 94406                 | 886           | 59.1             | 4.2                       |
| 109147                | 1108          | 61.7             | 3.0                       |
| 126644                | 1361          | 65.8             | 2.4                       |
| 140493                | 1645          | 66.4             | 1.0                       |

### 3.3. Numerical methodology

In this article, an effort has been made to understand the phenomenological features of spray formation based on the physical occurrence of the prevailing swirling flow inside a hydrocyclone taking advantage of Large-eddy simulation (LES) results. Here, objective is not to address the intricate details of convoluted hydrodynamics of spray discharge. With the help of single phase simulation, information regarding the magnitude of the azimuthal velocity are extracted. However, the hydrodynamic modeling of multiphase flow in swirl transport is a non-trivial computational challenge. Subgrid-scale modeling of interface deformation due to turbulence is still an open issue and although both options might be selected simultaneously in commercial CFD software there is no validation of such a use on benchmark two-phase flows.

The LES model is an intermediate approach between Reynolds-averaged Navier–Stokes (RANS) and Direct numerical simulation (DNS) where a filtering operation is employed to resolve the large scale eddies of the turbulent flow directly and only small scale (sub-grid scale (SGS)) eddies are modeled by the eddy viscosity approach (White, 1991). The filtered variable by the operation of a filtering function is defined as

$$\bar{F}(x) = \int_{\Omega} F(x')G(x, x')dx' \quad (3)$$

By applying the filtering function, the governing equation of motion for incompressible flow of a Newtonian fluid can be written as

$$\frac{\partial \bar{v}_i}{\partial t} + \bar{v}_j \frac{\partial \bar{v}_i}{\partial x_j} = -\frac{1}{\rho} \frac{\partial \bar{p}}{\partial x_i} - \frac{\alpha(\bar{v}_i \bar{v}_j - \bar{v}_i \bar{v}_j)}{\partial x_j} + \nu \frac{\alpha^2 \bar{v}_i}{\alpha x_j^2} \quad (4)$$

Here the term  $(\bar{v}_i \bar{v}_j - \bar{v}_i \bar{v}_j)$  is known as subgrid-scale (SGS) stress  $T_{ij}^{sgs}$ . Subsequently  $T_{ij}^{sgs}$  is calculated by Boussinesq hypothesis with an introduction of subgrid scale turbulent viscosity. This subgrid-scale stress is related to strain-rate  $\bar{S}_{ij}$  as

$$\bar{S}_{ij} = \frac{1}{2} \left( \frac{\partial \bar{v}_i}{\partial x_j} + \frac{\partial \bar{v}_j}{\partial x_i} \right) \quad (5)$$

In the Smagorinsky–Lilly model (Smagorinsky, 1963), the subgrid scale turbulent viscosity is estimated by

$$\mu_T^{sgs} = [\rho(C_s \Delta)^2] |\bar{S}| \quad (6)$$

where,  $\bar{S} = (2\bar{S}_{ij}\bar{S}_{ij})^{1/2}$ ,  $\Delta$  is the filter width and  $C_s$  is the Smagorinsky–Lilly constant.

The LES models involve bounded central differencing scheme inducing SIMPLE approach for pressure-velocity coupling in a finite volume solver platform of FLUENT@6.3 for solving the governing transport equation. The discretized versions of the governing equations are then solved using Gauss–Seidel policy along with algebraic multigrid (AMG) method. Additionally, in the present simulation, semi-implicit time discretization policy is employed for the temporal terms. One can find the details of simulation setup is same as in our previous publication. Detail description of the setup can be obtained from the reference study (Banerjee et al., 2015) along with validations, resolution test and the strategies to take care of other numerical intricacies.

## 4. Results and discussion

As discussed in Section 3, an attempt has been made to visually investigate and quantify the effect of the aforementioned parameters on the hydrocyclone discharge pattern. Thereafter, an attempt has also been made to build an empirical correlation of the governing parameters with spray angle using multivariate regression analysis along with

ANOVA (analysis of variance) for the developed model. The model may vary according to the system under investigation. The model has only been developed for the current system under investigation but can be easily adapted to any system of similar nature. Authors only intend to demonstrate a development of a model to understand the dependency of spray angle on various parameters for their specific geometry.

#### 4.1. Effect of swirl intensity on spray angle

Swirling intensity depends on the amount of feed pressure, inlet cross-sectional geometry and effective viscosity of the fluid. Feed pressure is an important parameter governing the centrifugal swirl intensity produced inside the hydrocyclone. An investigation of the dependency of the feed inlet pressure on spray angle is shown in Fig. 4. The underflow discharge spray angle as shown in Fig. 4 illustrates that increasing the feed inlet pressure at a fixed concentration in a constant geometry, spray angle increases.

However, all the factors affecting the intensity of the swirl produced inside a hydrocyclone can be clubbed together and quantified in terms of inlet Reynolds number. The Reynolds number is calculated using the following equation based on feeding slurry properties ( $\rho$  and  $\mu$ ).

$$Re_i = \frac{\rho v_i d}{\mu} \quad (7)$$

where, inlet velocity is calculated as

$$v_i = Q/A \quad (8)$$

where  $Q$  is the inlet flowrate and  $A$  is the inlet cross-section area.

This simple estimate of suspension viscosity has been compared to the correlation proposed by Eilers (Stickel and Powell, 2005), Krieger and Dougherty (1959) and Narasimha et al. (2014) in Fig. 5. It can be observed from the plot that the model predicted values significantly differ only at solids concentration above ~35% by volume. Under the operating conditions of the present experiments (solid content below 10% by volume) the deviation between the four correlations is minor. Hence, Thomas viscosity model (Eq. (9)) is used to calculate the feed inlet viscosity (Thomas, 1965) assuming a Newtonian response of the suspension for moderate shear rates.

$$\mu = \mu_0 \left[ 1 + 2.5\phi + 10.05\phi^2 + A \exp(B\phi) \right] \quad (9)$$

where,  $\mu$  and  $\mu_0$  are the viscosities of feed slurry and water respectively at 30 °C and coefficients  $A$  and  $B$  having values 0.00273 and 16.6 respectively for the above expression.

The prediction of viscosity model is only an estimate since the response of suspensions to complex flows is still not well understood as reviewed in the paper by Stickel and Powell (2005).

Further, plotting it against the spray angle at various feed solid concentration, it was found that the spray angle increases with increase in Reynolds number (Fig. 6). A similar observation was reported by Mazumdar et al. (2014) in the case of hydrocyclone running with water only. This may be because for a given operating and design variable, feed volumetric flow rate directly depends on feed inlet pressure and hence at a given cross-sectional feed area increases the feed inlet velocity with inlet pressure, ultimately increasing the Reynolds number. This increased Reynolds number intensifies the swirl intensity and ultimately increasing the tangential component of the exit velocity and hence increases the spray angle. At the exit of the spigot, the comparison between the three competing mechanisms yielding spray angle can be characterized in a dimensionless form. The Froude number is a measure of the relative importance of inertia (axial flow rate) to gravity acting on the liquid sheet at the exit of the nozzle.

However, the swirling motion generated by the tangentially introduced fluid creates an air core along the axis, normally connected to the atmosphere through the spigot opening. Reported literature (Hsieh and Rajamani, 1991; Concha et al., 1996; Narasimha et al., 2006; Neesse and Dueck, 2007; Krishna et al., 2010) addressed that the air core resides over the central region. Thus from the principle of Rankine vortex flow, it can be predicted that air core dynamics is predominantly governed by the forced vortex flow field. Here the theoretical concept adopted for estimation of air core diameter is based on boundary layer approximation theory by solving a set of non-homogeneous ODE. This approach has been adopted by various authors for estimating the air core for swirl atomizer (Som, 1983; Som and Biswas, 1984). The azimuthal velocity profile at three different heights and four different feed inlet pressure in a cyclone are shown in Fig. 7(a) and (b) respectively. Following this eventually leads to a scaling relationship for air core diameter with the inlet Reynolds number as follows;

$$\frac{d_a}{D_u} \propto Re_i^{0.05} \quad (10)$$

This theoretical relation provides a conservative estimation of air core diameter as if the core behaves as an elastic rod. The rationality of the theoretical model (Eq. (10)) has been established by verifying with experimental observations of the air core diameter reported in literature (Hsieh, 1988 and Krishna et al., 2010). Fig. 8 shows reasonable agreement with the observed trend of air core diameter with varying inlet flow rate and spigot diameter. From the comparison in the above Fig. 8, it appears that the present theoretical model gives a qualitative picture of air core diameter at a given operating condition.

Average axial velocity at the spigot opening was estimated by the underflow volumetric flow rate divided by the effective cross-sectional

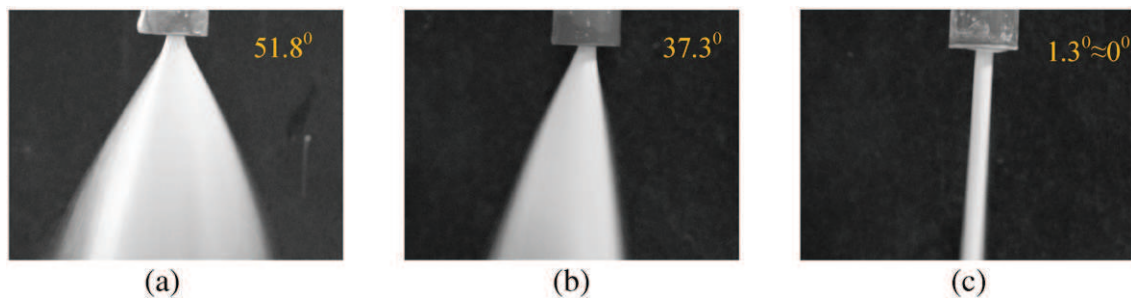


Fig. 9. Effects of increasing feed concentration on underflow discharge shape (a) Spray discharge (3% (w/w) solid concentration), (b) transition state (7% (w/w) solid concentration) and (c) rope discharge (12.5% (w/w) solid concentration) using  $D_o = 0.011$  m and  $D_u = 0.0045$  m and feed inlet pressure of 206,844 N/m<sup>2</sup>.



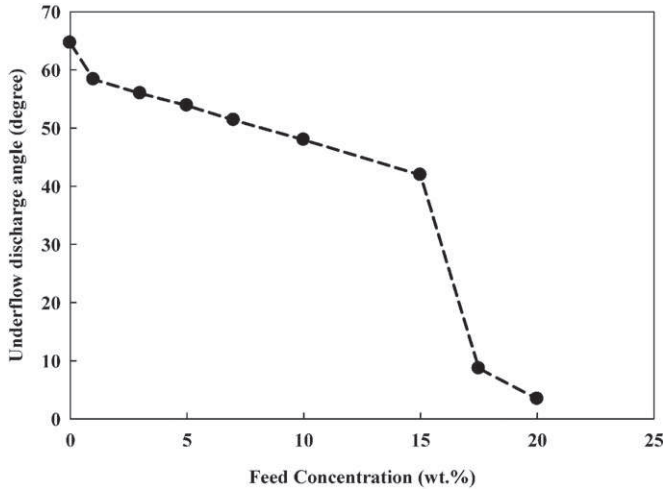


Fig. 10. Effect of feed concentration on spray angle using  $D_o = 0.011$  m and  $D_u = 0.0064$  m at FIP of  $206,844$  N/m<sup>2</sup>.

area. Therefore for calculation purpose average axial velocity ( $u$ ) has been estimated as;

$$u = \frac{Q_u}{A_c} = \frac{Q_u}{\frac{\pi D_u^2}{4} \left(1 - \left(\frac{d_a}{D_u}\right)^2\right)} \quad (11)$$

Based on the above explanation, we can estimate the axial velocity at the spigot. For water conditions only, the range of variation of the dimensionless Froude number is reported in Table 5 ( $Fr = u^2/g e$  where  $e$  stands for the liquid sheet thickness at the spigot).

Clearly,  $Fr \gg 1$  which means that gravitational acceleration has little effect on the spray shape and discharge angle with water only. Therefore, a simple prediction of the spray angle can be tested against experiments assuming that the angle is dictated by the axial and azimuthal velocity intensities. The azimuthal velocity has been estimated from a study on hydrocyclone computational fluids dynamics. The detail hydrodynamics using three-dimensional simulations has been adopted to quantify the phenomenological feature of swirl flow inside hydrocyclone.

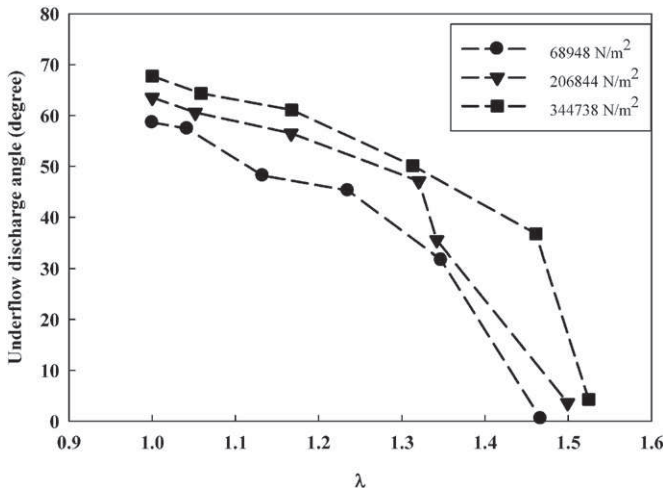


Fig. 11. Effect of ratio of underflow pulp density to feed pulp density on spray angle using  $D_o = 0.011$  m and  $D_u = 0.0045$  m.

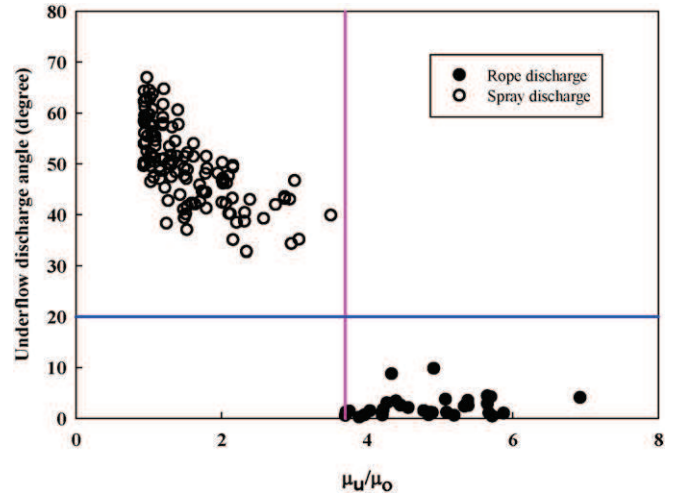


Fig. 12. Spray angle vs. enhanced mixture viscosity  $\mu_u/\mu_o$  from Eq. (9) at the spigot opening.

The calculated angle in Table 5 is given by  $\theta = 2 \arctan (w/u)$ . Compared to experiments, the error is only a few percents and shows a monotonous decrease when  $Fr$  is increasing corresponding to less effect of gravity on the spray angle. Spray angle is therefore dictated by flow inertia effect at the spigot opening for water only.

#### 4.2. Effect of pulp density on spray angle

There are four forces acting on the slurry at the exit of the spigot that are typically important in spray formation. They are gravity force, inertia, surface tension, and viscosity. When the pulp density at the feed varies the interplay between these physical mechanisms may change leading to drastically different discharge regimes. Pulp density plays an important role in deciding the shape of the underflow discharge and it is directly governed through solid concentrations. A visual investigation of the dependency of the feed inlet solid concentration on spray angle is shown in Fig. 9. The significant change in flow pattern can easily be perceived with the corresponding change in the underflow discharge angle. It can easily be observed from Fig. 9 that underflow discharge regime gradually shifts from spray to rope discharge with the subsequent increase in feed solid concentration. A drastic change of behavior is observed between 7% (spray discharge) and 12.5% (rope discharge) feed concentration. This is in agreement with the numerical study of Davailles et al. (2012). It can also be observed from Fig. 10 that at the

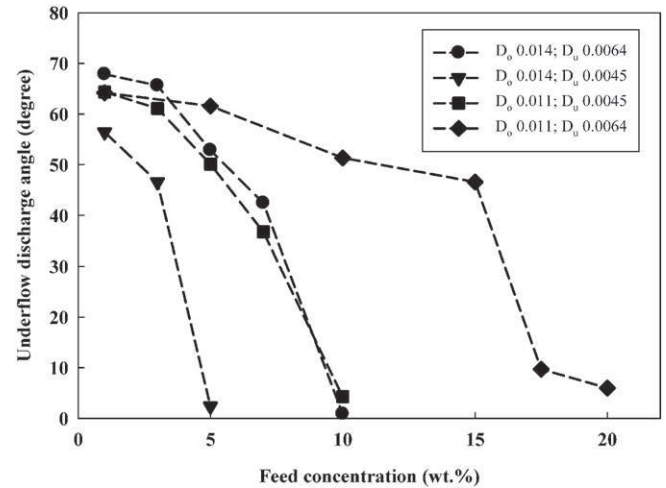


Fig. 13. Effect of feed concentration on spray angle using different  $D_o$  and  $D_u$ .

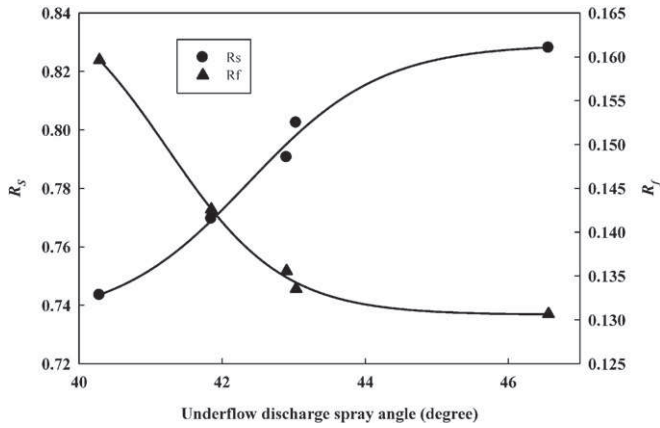


Fig. 14. Variation of solid and water recovery with spray angle using  $D_o = 0.011$  m and  $D_u = 0.0064$  m at fixed feed conc. of 15% (w/w).

lower feed concentration, slurry practically behaves like water and as the solid concentration increases, the underflow discharge spray angle becomes lower. The increase of mass loading increases the density but has also a strong impact of the slurry viscosity. The dimensionless Froude number characterizes the relative contributions of inertia ( $u^2$ ) and gravity ( $g$ ) at the spigot opening. Increasing solid content in the feed increases slurry viscosity, therefore inlet kinetic energy is strongly dissipated in the core of hydrocyclone. At spigot opening, under rope conditions, the very dense suspension has a low velocity ( $Fr$  is reduced compared to spray discharge conditions) which gives more important role to gravity. However, at higher feed solid concentration, particles' hindered settling condition prevails which does not conform to the Stokes' law and gravity force dominate the exit velocity profile. A large amount of momentum from the feed injection is dissipated within the hydrocyclone where the swirl velocity has been significantly damped leading to the lower azimuthal velocity at the spigot opening and therefore small discharge angle. It may in some extent lead to the collapse of the air core and possible choking of the hydrocyclone.

However, any change in feed concentration will change exit pulp densities and will affect the spray profile through underflow. Therefore, an attempt was made to study the effect of  $\lambda$  (ratio of the underflow pulp density to feed pulp density) on the nature of underflow discharge shape. Fig. 11 is plotted to highlight the effects of pulp densities on underflow discharge spray angle at different feed inlet pressures.

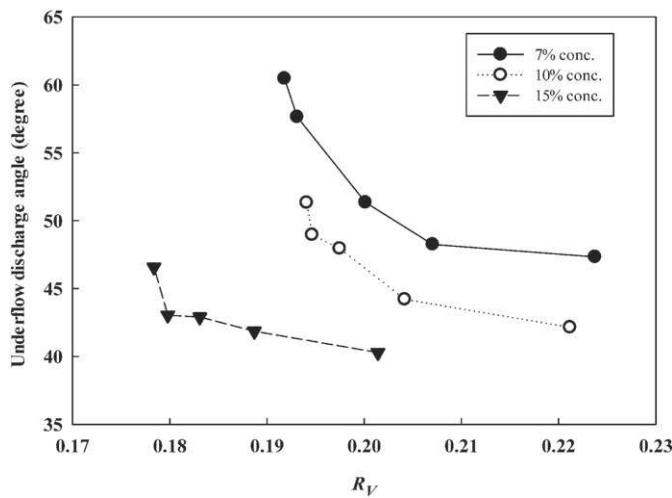


Fig. 15. Variation of UF slurry recovery with spray angle using  $D_o = 0.011$  m and  $D_u = 0.0064$  m at different feed conc. level

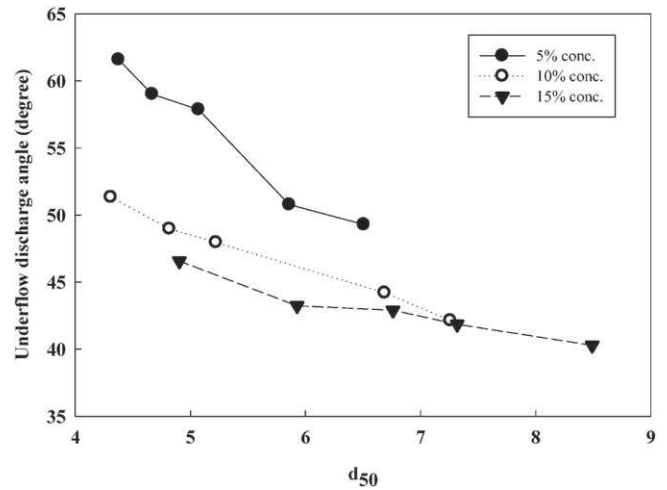


Fig. 16. Variation of  $d_{50}$  w.r.t. underflow discharge angle using  $D_o = 0.011$  m and  $D_u = 0.0064$  m.

It can be observed from Fig. 11 that with increasing  $\lambda$ , spray angle decreases. This may be because as increasing the solid concentration in the feed will increase the solid flow rate in the underflow and lessen the amount of water reporting, thereby increasing the underflow pulp density and viscosity. At high feed solid content, accumulation of solid particles exceeds in conical section than the discharge rate. The coarser particles will be predominantly affected by gravitational force and will overcome the spray generating swirling nature and thereby tending to reduce the spray angle. Relative finer particle, although following the path of swirling water will not dominate the discharge profile shape as they are fewer in quantity in discharge. Lower feed solid concentration will result in increased water recovery in underflow with fewer solid reporting and thereby decreasing the underflow pulp density. This will result in swirl dominance in spray profile and will tend to increase the spray angle. Similar conclusions have been drawn from computational fluids simulations (Davailles et al., 2012). When the feed concentration is increased, mass loading and viscosity enhancement will dissipate the momentum of the slurry and centrifugal separation will decrease (lower azimuthal velocity). At spigot opening, under rope conditions, the very dense suspension has a low velocity ( $Fr$  is reduced compared to spray discharge conditions) which gives the more important role of gravity. Therefore, particles are driven by gravity and the velocity at the spigot opening is almost vertical yielding to small discharge angle (roping). An estimate of the enhanced mixture viscosity

Table 6  
Significance test of model parameters (ANOVA).

| Regression statistics |                     |                       |               |                |                       |                  |
|-----------------------|---------------------|-----------------------|---------------|----------------|-----------------------|------------------|
| Multiple R            |                     |                       |               |                | 0.964                 |                  |
| R square              |                     |                       |               |                | 0.929                 |                  |
| Adjusted R square     |                     |                       |               |                | 0.926                 |                  |
| Standard error        |                     |                       |               |                | 0.043                 |                  |
| Observations          |                     |                       |               |                | 100                   |                  |
|                       | <i>df</i>           | <i>SS</i>             | <i>MS</i>     | <i>F</i>       | <i>Significance F</i> |                  |
| Regression            | 4                   | 2.345                 | 0.586         | 311.224        | 1.14936E-53           |                  |
| Residual              | 95                  | 0.179                 | 0.002         |                |                       |                  |
| Total                 | 99                  | 2.524                 |               |                |                       |                  |
|                       | <i>Coefficients</i> | <i>Standard error</i> | <i>t Stat</i> | <i>P-value</i> | <i>Lower 95%</i>      | <i>Upper 95%</i> |
| Intercept             | -0.3390             | 0.2220                | -1.527        | 0.130          | -0.780                | 0.102            |
| $\ln(D_u/D_c)$        | 0.0766              | 0.0268                | 2.855         | 0.005          | 0.023                 | 0.130            |
| $\ln(D_o/D_c)$        | -0.1414             | 0.0297                | -4.760        | 6.9101E-06     | -0.200                | -0.082           |
| $\ln(\lambda)$        | -1.2726             | 0.0466                | -27.307       | 9.1055E-47     | -1.365                | -1.180           |
| $\ln(Re)$             | 0.3752              | 0.0174                | 21.593        | 2.033E-38      | 0.341                 | 0.410            |

**Table 7**  
Model validation with water only condition.

| Du<br>(m) | Do<br>(m) | Inlet pressure<br>(N/m <sup>2</sup> ) | V <sub>i</sub><br>(m/s) | Re     | Experimental $\theta$<br>(degree) | Predicted $\theta$ (Mazumdar et al., 2014)<br>(degree) | Predicted $\theta$ (present Eq. (13))<br>(degree) | % error |
|-----------|-----------|---------------------------------------|-------------------------|--------|-----------------------------------|--|---|---------|
| 0.0064    | 0.014     | 68948                                 | 7.94                    | 88235  | 58.31                             | 57.03  | 53.81   | 7.72    |
|           |           | 137895                                | 11.11                   | 123455 | 65.96                             | 65.24  | 61.13   | 7.32    |
|           |           | 206843                                | 13.24                   | 147115 | 71.18                             | 69.97  | 65.34   | 8.2     |
|           |           | 275790                                | 15.52                   | 172548 | 75.8                              | 74.58  | 69.42   | 8.41    |
|           |           | 344738                                | 17.51                   | 194656 | 76.66                             | 78.27  | 72.68   | 5.19    |
| 0.0064    | 0.011     | 68948                                 | 7.12                    | 79156  | 52.87                             | 54.22  | 53.4  | 1.01    |
|           |           | 137895                                | 9.51                    | 105726 | 57.79                             | 60.87  | 59.61   | 3.16    |
|           |           | 206843                                | 11.83                   | 131460 | 64.63                             | 66.41  | 64.76   | 0.2     |
|           |           | 275790                                | 13.35                   | 148432 | 66.04                             | 69.72  | 67.82   | 2.68    |
|           |           | 344738                                | 15.02                   | 166942 | 68.36                             | 73.07  | 70.91   | 3.73    |
| 0.0045    | 0.011     | 68948                                 | 6.99                    | 77709  | 53.62                             | 53.44  | 51.56   | 3.85    |
|           |           | 137895                                | 10.05                   | 111706 | 61.67                             | 61.79  | 59.18   | 4.03    |
|           |           | 206843                                | 11.62                   | 129148 | 63.54                             | 65.48  | 62.54   | 1.59    |
|           |           | 275790                                | 13.48                   | 149851 | 65.3                              | 69.49  | 66.17   | 1.34    |
|           |           | 344738                                | 14.96                   | 166238 | 68.75                             | 72.44  | 68.83   | 0.13    |
| 0.0032    | 0.008     | 68948                                 | 5.86                    | 65139  | 51.35                             | 48.99  | 49.06   | 4.46    |
|           |           | 137895                                | 7.88                    | 87631  | 57.75                             | 55.16  | 54.91   | 4.93    |
|           |           | 206843                                | 9.66                    | 107342 | 62.25                             | 59.82  | 59.31   | 4.73    |
|           |           | 275790                                | 10.81                   | 120190 | 65.01                             | 62.59  | 61.91   | 4.77    |
|           |           | 344738                                | 11.89                   | 132151 | 66.47                             | 65.01  | 64.19   | 3.43    |

$\mu_u/\mu_o$  by the presence of particles can be drawn from Thomas relation (Eq. (9)). The concentration of the slurry at the underflow has been determined based on the global mass balance in the hydrocyclone (particle partitioning at under and overflow were measured along all experiments). Over the range of operating conditions, we tested,  $\mu_u/\mu_o$  varies from 1 (pure water) to 6.93 for the concentrated slurry.

There is a strong correlation between the increase of the slurry viscosity and the spray angle (see in Fig. 12 the monotonous decrease of spray angle with  $\mu_u/\mu_o$  and the sharp decrease of spray angle for an enhanced slurry viscosity above 4). The transition from spray to roping is observed for  $\mu_u/\mu_o \sim 4$  corresponding to the volumetric concentration at the spigot slightly larger than 40% (65wt.%). Such behavior is expected because Yao et al. (2012) investigated the effect of fluid viscosity on stability and angle of spray generated by a swirl atomizer. The fluid viscosity has been varied by mixing water with increasing concentration of glycerol. In their experiments, a sharp decrease of the spray angle measured by high-speed shadowgraphy has been observed for 50% of glycerol content in water corresponding to  $\mu_u/\mu_o \sim 5$ . The analogy is straightforward with the effect of particle presence on the slurry dynamics at the spigot. Enhanced viscosity dissipates the inlet momentum

and the azimuthal velocity (lower centrifugal force) at the spigot opening. The ratio of azimuthal to axial flow velocity is reduced and consequently yields drastic reduction of the spray angle (roping regime).

#### 4.3. Effect of outlet diameters (design variables)

The outlet dimensions are another important physical parameters used to change the operational feature. As reported by many authors (Plitt et al., 1987; Concha et al., 1996), the separation performance of an industrial hydrocyclone is controlled by the cone ratio (ratio of the spigot to the vortex finder). Shah et al. (2006) suggested that the use of cone ratio as a design variable is insignificant and can sometimes be misleading. The diameter of the vortex finder ( $D_o$ ) and spigot ( $D_u$ ) individually has an effect on the water split behavior in hydrocyclone. Therefore, in this study, the individual role of these two parameters on the spray angle has also been explored.

It may be observed from Fig. 13 that for a given operating condition the change in vortex finder diameter has a significant effect on hydrocyclone performance. An increase in the diameter of the vortex finder will result in more water and some solids reporting to overflow.

**Table 8**  
Model validation with experimental spray angle.

| Du<br>(m) | Do<br>(m) | Solid Conc.<br>(%w/w) | FIP<br>(N/m <sup>2</sup> ) | UFds/Fds ( $\lambda$ ) | Re     | SA( $\theta$ )<br>(degree) | S.D. of measured SA | Predicted SA ( $\theta$ )<br>(degree) | % error |
|-----------|-----------|-----------------------|----------------------------|------------------------|--------|----------------------------|---------------------|---------------------------------------|---------|
| 0.0045    | 0.011     | 1                     | 68948                      | 1.04                   | 80356  | 52.4                       | 1.14                | 49.56                                 | 5.42    |
| 0.0045    | 0.011     | 3                     | 68948                      | 1.13                   | 75900  | 45.17                      | 1.15                | 43.62                                 | 3.43    |
| 0.0045    | 0.011     | 3                     | 137896                     | 1.15                   | 100149 | 50.05                      | 1.03                | 47.54                                 | 5.01    |
| 0.0045    | 0.011     | 3                     | 206844                     | 1.17                   | 122753 | 50.48                      | 0.97                | 50.42                                 | 0.12    |
| 0.0045    | 0.011     | 3                     | 275792                     | 1.18                   | 144252 | 54.32                      | 1.03                | 52.97                                 | 2.49    |
| 0.0045    | 0.011     | 5                     | 68948                      | 1.24                   | 75760  | 41.94                      | 0.59                | 39.05                                 | 6.89    |
| 0.0045    | 0.011     | 5                     | 206844                     | 1.32                   | 124463 | 46.09                      | 0.88                | 43.33                                 | 5.99    |
| 0.0045    | 0.011     | 7                     | 206844                     | 1.34                   | 124621 | 38.54                      | 1.12                | 42.46                                 | 10.17   |
| 0.0045    | 0.011     | 7                     | 275792                     | 1.44                   | 147112 | 39.14                      | 1.08                | 41.23                                 | 5.34    |
| 0.0064    | 0.011     | 5                     | 206844                     | 1.11                   | 125633 | 53.86                      | 0.56                | 55.92                                 | 3.82    |
| 0.0064    | 0.011     | 7                     | 68948                      | 1.13                   | 74739  | 47.33                      | 0.89                | 44.89                                 | 5.16    |
| 0.0064    | 0.011     | 10                    | 68948                      | 1.18                   | 76320  | 42.15                      | 0.76                | 42.84                                 | 1.64    |
| 0.0064    | 0.011     | 10                    | 137896                     | 1.21                   | 96244  | 44.21                      | 1.03                | 45.05                                 | 1.90    |
| 0.0064    | 0.011     | 15                    | 68948                      | 1.27                   | 73898  | 40.29                      | 1.43                | 38.39                                 | 4.72    |
| 0.0045    | 0.014     | 1                     | 68948                      | 1.07                   | 86166  | 46.34                      | 1.04                | 47.66                                 | 2.85    |
| 0.0045    | 0.014     | 1                     | 137896                     | 1.07                   | 118464 | 51.83                      | 0.93                | 53.75                                 | 3.70    |
| 0.0045    | 0.014     | 3                     | 68948                      | 1.22                   | 95518  | 39.98                      | 1.37                | 41.79                                 | 4.53    |

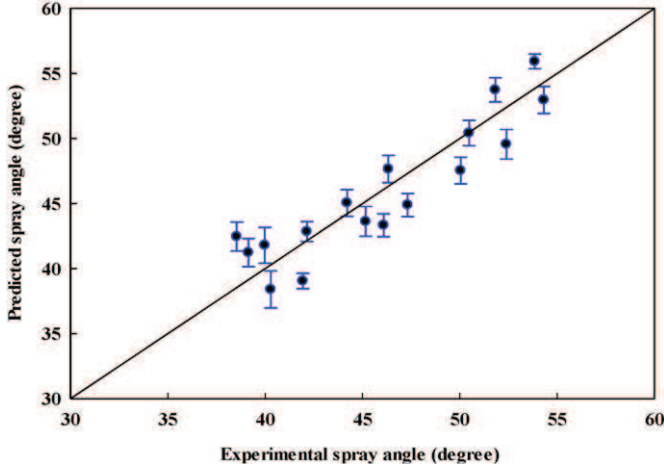


Fig. 17. Comparison between experimental and predicted spray angle (degree).

However, this reduced amount of water reporting to underflow will increase underflow pulp density and the spray angle becomes lower. It may likewise be noted that at a fixed vortex finder diameter and inlet pressure, the spray angle increases with increase in spigot diameter because an increase in spigot diameter results in more water reporting to underflow essentially reducing the resistance offered by the ejection area to the swirling motion of liquid inside it. The ratio  $w/u$  increases with increase in  $Du$  hence the  $\theta$  ( $2 \tan^{-1}(w/u)$ ) increases.

#### 4.4. Variation of hydrocyclone performance indices w.r.t. spray angle

In the present study, we are intended to show that spray angle is a good indicator of hydrocyclone performance, it is only possible when the change in response gets (performance indices) reflected through spray angle (respective change). During the study, it was noticed that the hydrocyclone performance is interrelated with underflow discharge angle. From Fig. 14–16 it can be observed that performance indices, e.g., cut size ( $d_{50}$ ),  $R_S$ ,  $R_F$  and  $R_V$  alter with changing in spray angle. At the same level of feed solid concentration, an increase in feed inlet pressure (increase in swirl intensity) leads to increase in spray angle while cut size reduces (Fig. 16). With the increase in spray angle, underflow solid recovery increases while underflow water and slurry recovery ( $R_V$ ) decreases at fixed concentration (Fig. 14 and 15 respectively). At higher feed inlet pressure, more solids move towards the wall side of the cyclone (high centrifugal force than drag force) and report to underflow whereas more water report to overflow. Therefore, underflow water recovery decreases w.r.t. feed water. So, based on the present study, it can be interpreted that the spray angle is an indicator of hydrocyclone performance.

### 5. Overall correlation and model validation

As reported by Mazumdar et al. (2014) and as observed above in Section 4, the parameters affecting the spray formation follows a power law mathematically. Therefore, in order to interrelate the individual variables with spray angle on the basis of above trend an attempt has been made to derive an empirical correlation to quantify the combined effect of different parameters on spray. The model would take an empirical form as shown below.

$$\theta = K * (D_u)^a (D_o)^b (Re_i)^c (\lambda)^d \quad (12)$$

To find the value of the constant  $K$  and exponent  $a$ ,  $b$ ,  $c$  and  $d$ , respectively multivariate regression analysis of all the experimental data was performed. The dependency of the spray angle along with all the dependent variables was converted from power law to linear form by taking

logarithm on both sides. Consequently, a multivariate linear regression analysis was done using Minitab statistical software. After deriving the model, the equation generated was converted to its original form by taking antilogarithm on both sides. Mathematically the model can be expressed as mentioned below,

$$\theta = 0.7 * \left(\frac{D_u}{D_c}\right)^{0.08} \left(\frac{D_o}{D_c}\right)^{-0.14} (Re_i)^{0.38} (\lambda)^{-1.27} \quad (13)$$

In the above-developed model, hydrocyclone diameter ( $D_c$ ) is a relevant scale but has not been varied in the present study. Only spray discharge conditions are considered to develop the correlation (Eq. (13)). Rope discharge conditions' data (higher feed concentration) are not part of this. In rope discharge condition, internal hydrodynamics are different in comparison to spray condition. Once rope commences then further if we increase the feed solid concentration, underflow discharge angle does not alter ( $\approx 0^\circ$ ).

The model described in the following correlation provided a reasonable description of the data (Adjusted  $R^2 = 0.92$ ). Various hypothesis testing is done to verify the acceptance of the developed model and are explained in brief in the following paragraph. It is however important to mention that all the statistical analysis is done at a confidence interval of 95% or at  $\alpha$  level of 0.05.

A preliminary investigation of P value (significance F) shows that the value obtained from the model output ( $<0.01$ ) is less than  $\alpha$  level of 0.05. This gives an initial positive result for accepting the overall regression relationship (Table 6). Further, F-test helps in establishing whether the proposed relationship in the form of the model is statistically reliable or not. This is useful when the objective of developing the model is a prediction or explanation of generating the experimental data set. A significant F-test indicates that the  $R^2$  is reliable. Calculating F ( $\alpha$ ;  $k$ ;  $n-k-1$ ), we get an approximate value of 2.5, which is less than the F value of ANOVA output ( $F = 311.22$ ).  $k$  denotes the number of independent variables and  $n$  denotes the number of observations for each independent variable. P-value of significance F test is very low which rejects the null hypothesis. Thus the regression model passes the F-test and the coefficient of correlation obtained is also found to be significant. However, the existence of a regression relation in itself does not justify that meaningful and accurate prediction can be made. Further tests have to be conducted to establish the significance of coefficient of each independent variable. Preliminary visual investigation of the P-values of the entire independent variable class signifies that coefficients are significant and are affecting the dependent variable. To further establish the fact, t-test can be performed. A two-tailed t-test and at a confidence level of 95%, i.e. at  $\alpha$  level of 0.05 was performed and value  $t(\frac{\alpha}{2}; n-k-1)$  was compared with the t values of ANOVA output for all the variables. It was found that all the coefficients report as significant.

Various hypothesis testing is adopted further to strengthen the confidence in the above-mentioned model. The statistical analysis carried out henceforth has been done at 95% confidence interval. P-test, F-test, and two-tailed t-tests have been carried out to establish the statistical reliability of the empirical model towards prediction or explanation of the experimental observation. Hence, based on statistical analysis, the developed model is significant and all the independent variables seem to be affecting the dependent variable.

Initially, the spray angle from the developed model was compared with experimental spray angle for water only condition putting which was shown in Table 7. Predicted spray angle from the present model has good agreement (putting  $\lambda = 1$ ) with experimental spray angle with water only condition and also compared with data obtained from Mazumdar et al. (2014) model.

To evaluate the predictive capability of the developed model, 17 individual experiments were carried out at random within the range of the variables selected with slurry. The random experimental data

generated are then compared with the predicted spray angle at identical operating conditions (Table 8).

The comparative plot is shown in Fig. 17. It may be perceived that the developed model agrees well with the experimental data as the relative error between the predicted and experimental data is below 6% (some outliers due to high turbulence nature). The respective standard deviation within the measured spray angle has also been shown by the error bars.

## 6. Conclusion

In the present study, it has been successfully demonstrated that the algorithm developed in case of water is equally capable of calculating the spray angle in the case of hydrocyclone operating with slurry. It has also been further established that the spray angle remains stable and is reproducible under a given operating condition. Spray angle seems to be an indicator of internal hydrodynamic flow patterns as the spray angle varies significantly with a number of different operating and geometric parameters of the hydrocyclone. It was further established that spigot and vortex finder diameter, inlet Reynolds number and feed and underflow pulp density are the major parameters to determine the shape of underflow discharge in a hydrocyclone. Empirical correlation using multivariate regression analysis shows that dependency of the spray angle with the above-mentioned parameters takes a form which can be mathematically described as,

$$\theta = 0.7 * \left(\frac{D_u}{D_c}\right)^{0.08} \left(\frac{D_o}{D_c}\right)^{-0.14} (Re_i)^{0.38} (\lambda)^{-1.27}$$

This developed correlation only shows that spray angle is an indicator of hydrocyclone performance which depends on various parameters (mentioned in Section 4) and hydrocyclone performance can be monitored by monitoring the discharge pattern.

F-test, t-test and relevant significance test (p test) have been carried out to establish the statistical relevance of the developed model. However, the present study has been performed entirely with mono density (silica sand) feed particles and identical feed size distribution, so the effect of feed particle density and feed size distribution are not part of this study. Further study is hence required in this regard to re-affirm the use of spray discharge profile as an indicator of performance.

## Appendix A. Supplementary data

Supplementary data to this article can be found online at <http://dx.doi.org/10.1016/j.minpro.2016.07.002>.

## References

Banerjee, C., Kaustav, C., Kumar, M.A., Suman, C., 2015. Swirling flow hydrodynamics in hydrocyclone. *Ind. Eng. Chem. Res.* 54, 522–528.

Barrientos, A., Concha, F., 1992. Phenomenological model of classification in conventional hydrocyclones. *Communication* 21, 287–305.

Castro, O., 1990. Pulp rheology Effects for Hydrocyclone Models (M.Sc.Thesis) University of Queensland (JKMRC), Brisbane, Australia.

Concha, F., Barrientos, A., Montero, J., Sampaio, R., 1996. Air core and roping in hydrocyclones. *Int. J. Miner. Process.* 44–45, 743–749.

Davailles, A., Climent, E., Bourgeois, F., Majumder, A.K., 2012. Analysis of swirling flow in hydrocyclones operating under dense regime. *Miner. Eng.* 31, 32–41.

Hsieh, K.T., 1988. A Phenomenological Model of the Hydrocyclone (PhD Thesis) University of Utah.

Hsieh, K.T., Rajamani, K., 1991. Mathematical model of the hydrocyclone based on physics of fluid flow. *AIChE J.* 37, 735–746.

Krieger, I.M., Dougherty, T.J., 1959. A mechanism for non-Newtonian flow in suspensions of rigid spheres. *Trans. Soc. Rheol.* 3, 137–152.

Krishna, V., Sriprya, R., Kumar, V., Chakraborty, S., Meikap, B.C., 2010. Identification and prediction of air core diameter in a hydrocyclone by a novel online sensor based on digital signal processing technique. *Chem. Eng. Process.* 49, 165–176.

Kundu, P.K., Cohen, I.M., 2009. *Fluid Mechanics*. fourth ed. Academic Press, USA.

Lynch, A.J., Rao, T.C., 1975. Modelling and Scale-up of Hydrocyclone Classifiers. Proceedings of XIth International Mineral Processing Congress, Cagliari, pp. 245–269.

Marlow, D., 1973. A Mathematical Analysis of Hydrocyclone Data (M.Sc. Thesis) University of Queensland (JKMRC), Brisbane, Australia.

Mazumdar, A., Dubey, R.K., Banerjee, C., Sengupta, K., Majumder, A.K., 2014. A study on the characteristics of spray angle formation in a 2 inch hydrocyclone using water only. *Int. J. Miner. Process.* 126, 141–145.

Monredon, T.C., Hsieh, K.T., Rajamani, R.K., 1992. Fluid flow model of the hydrocyclone: an investigation of device dimensions. *Int. J. Miner. Process.* 35 (1–2), 65–83.

Nageswararao, K., 1978. Further Developments in the Modelling and Scale-up of Industrial Hydrocyclones (Ph.D. Thesis) University of Queensland (JKMRC), Brisbane, Australia.

Narasimha, M., Mathew, B., Holtham, P.N., 2006. Large eddy simulation of hydrocyclone-prediction of air-core diameter and shape. *Int. J. Miner. Process.* 80, 1–14.

Narasimha, M., Mainza, A.N., Holtham, P.N., Powell, M.S., Brennan, M.S., 2014. A semi-mechanistic model of hydrocyclones - developed from industrial data and inputs from CFD. *Int. J. Miner. Process.* 133, 1–12.

Neesse, T., Schneider, M., Dueck, J., Golyk, V., Buntenbach, S., Tiefel, H., 2004a. Hydrocyclone operation at the transition point rope/spray discharge. *Miner. Eng.* 17, 733–737.

Neesse, T., Dueck, J., 2007. Air core formation in the hydrocyclone. *Miner. Eng.* 20, 349–354.

Neesse, T., Schneider, M., Golyk, V., Tiefel, H., 2004b. Measuring the operating state of the hydrocyclone. *Miner. Eng.* 17, 697–703.

Otsu, N., 1979. A threshold selection method from gray-level histograms. *IEEE Trans. Syst. Man Cybern.* 9 (1), 62–66.

Petersen, K.R.P., Aldrich, C., Van Deventer, J.S.J., McInnes, C., Stange, W.W., 1996. Hydrocyclone underflow monitoring using image processing methods. *Miner. Eng.* 9 (3), 301–316.

Plitt, L.R., Flintoff, B.C., Stoffo, T.J., 1987. Roping in hydrocyclones. In: Wood, P. (Ed.), Proceedings of the 3rd International Conference on Hydrocyclones, Oxford, BHRA, Elsevier, Amsterdam, A-3, pp. 21–34.

Plitt, L.R., 1976. Mathematical model of the hydrocyclone classifier. *CIM Bull.* 69 (776), 114–123.

Rashid, M.S.F.M., Hamid, A.H.A., Sheng, O.C., Ghaffar, Z.A., 2012. An experimental investigation on the effect of various swirl atomizer orifice geometries on the air core diameter. *Appl. Mech. Mat.* 225, 32–37.

Shah, H., Majumder, A.K., Barnwal, J.P., 2006. Development of water split model for a 76 mm hydrocyclone. *Miner. Eng.* 19, 102–104.

Smagorinsky, J., 1963. General circulation experiments with the primitive equations. *Mon. Weather Rev.* 91, 99–164.

Som, S.K., 1983. Theoretical and experimental studies on the formation of an air core in a swirl spray pressure nozzle using a power law non-Newtonian liquid. *Appl. Sci. Res.* 40, 71–91.

Som, S.K., Biswas, G., 1984. Initiation of air core in a swirl nozzle using time-independent power-law fluids. *Acta Mech.* 51, 179–197.

Som, S.K., Mukherjee, S.G., 1980. Theoretical and experimental investigations on the coefficient of discharge and spray cone angle of a swirl spray atomizing nozzle. *Acta Mech.* 36, 79–102.

Sriprya, R., Kaulaskar, M.D., Chakraborty, S., Meikap, B.C., 2007. Studies on the performance of a hydrocyclone and modeling for flow characterization in presence and absence of air core. *Chem. Eng. Sci.* 62 (22), 6391–6402.

Stickel, J.J., Powell, R.L., 2005. Fluid mechanics and rheology of dense suspensions. *Annu. Rev. Fluid Mech.* 37, 129–149.

Thomas, D.G., 1965. Transport characteristics of suspension: VIII. A note on the viscosity of Newtonian suspensions of uniform spherical particles. *J. Colloid Sci.* 20, 267–277.

Van Deventer, J.S.J., Feng, D., Petersen, K.R.P., Aldrich, C., 2003. Modelling of hydrocyclone performance based on spray profile analysis. *Int. J. Miner. Process.* 70, 183–203.

Van, V., Janse, M.J., Aldrich, C., Auret, L., 2011. Detecting changes in the operational states of hydrocyclones. *Miner. Eng.* 24, 1532–1544.

Viljoen, T., 1993. Recent Developments in Instrumentation. SAIMM School: Process Simulation, Control and Optimization, Randburg, South Africa.

White, F.M., 1991. *Viscous Fluid Flow*. McGraw-Hill, Second.

Williams, R.A., Dickin, F.J., Gutierrez, J.A., Dyakowski, T., Beck, M.S., 1997. Using electrical impedance tomography for controlling hydrocyclone underflow discharge. *Control. Eng. Pract.* 5 (2), 253–256.

Yao, S., Zhang, J., Fang, T., 2012. Effect of viscosities on structure and instability of sprays from a swirl atomizer. *Exp. Thermal Fluid Sci.* 39, 158–166.