Rheological Characteristics of Ice Slurries Based on Propylene- and Ethylene-Glycol at High Ice Fractions

Senda Trabelsi, Sébastien Poncet, Michel Poirier

Abstract—Ice slurries are considered as a promising phase-changing secondary fluids for air-conditioning, packaging or cooling industrial processes. An experimental study has been here carried out to measure the rheological characteristics of ice slurries. Ice slurries consist in a solid phase (flake ice crystals) and a liquid phase. The later is composed of a mixture of liquid water and an additive being here either (1) Propylene-Glycol (PG) or (2) Ethylene-Glycol (EG) used to lower the freezing point of water. Concentrations of 5%, 14% and 24% of both additives are investigated with ice mass fractions ranging from 5% to 85%. The rheological measurements are carried out using a Discovery HR-2 vane-concentric cylinder with four full-length blades. The experimental results show that the behavior of ice slurries is generally non-Newtonian with shear-thinning or shear-thickening behaviors depending on the experimental conditions. In order to determine the consistency and the flow index, the Herschel-Bulkley model is used to describe the behavior of ice slurries. The present results are finally validated against an experimental database found in the literature and the predictions of an Artificial Neural Network model.

Keywords—ice slurry, propylene-glycol, ethylene-glycol, rheology, artificial neural network.

I. INTRODUCTION

Today to produce cold, the choice of the appropriate refrigerant is limited. Especially since most remaining fluids, even if they do not destroy the ozone layer, are greenhouse gases. The solution is to use other fluids to transport cold. Researches have shown that ice slurry transports the cold well, is energy efficient and avoids breaks in the cold chain [1].

In recent years, there is a growing interest for two-phase refrigerants and in particular for ice slurries. They represent an alternative secondary fluid in conventional refrigeration systems. Several definitions of ice slurry have been proposed among others [2]-[4]:

- Definition 1. Ice slurry consists of a number of ice particles in an aqueous solution.
- Definition 2. Fine-crystalline ice slurry is an ice slurry with ice particles with an average characteristic diameter, which is equal or smaller than 1 mm.

Attention needs to be given to the concentration of additives, which are commonly used in secondary refrigerants, and which affect all thermo-physical properties of the slurries like its freezing temperature. Many authors [5]-[7] have discussed the behavior of ice slurries and explained when it behaves as Newtonian or non-Newtonian fluids. Several experiments show that ice slurry behaves as Newtonian fluid at low ice concentrations, and as a non-Newtonian fluid at high ice concentrations generally up to 25% [7]. With the appearance of new ice slurry generators are able to produce more concentrated ice slurries (up to 70%); for the fishery industry especially, there is a clear need to develop new correlations for the ice slurry properties. This paper is an attempt to fill this gap for the dynamic viscosity. The objective is then to develop new correlations valid for a wider range of ice concentration, to be used in future numerical modelings.

The paper is organized as follows. First, the experimental method is described in Section II. The dynamic viscosity will be described by the Herschel-Bulkley model for steady state conditions in Section III from different rheograms for PG or EG additives and different ice fractions. Finally, the present results are validated by an experimental database available in the literature and the predictions of an Artificial Neural Network model in Section IV.

II. EXPERIMENTAL APPARATUS

The experimental apparatus illustrated in Fig. 1 represents a Discovery Hybrid Rheometer HR-2 manufactured by TA Instrument using a vane-concentric cylinder geometry with four full-length blades.
The vane geometry with a large gap is commonly used to characterize the rheology of complex fluids [8], [9]. Many studies used the vane to study concentrated aggregated dispersions [10]-[12]. According to Barnes et al. [8], [9], the vane in-cup geometry has several advantages: Shear sensitive samples can be measured without damaging their structure before testing and the gap can be sufficiently wide compared to the size of the particles.

The ice slurry generator is the 341 model developed by Taylor Bazinet. The ice concentration is controlled mainly by controlling the time to produce the slurry and by the viscous resistance during the solidification process.

Figs. 2-5 show the evolution of the shear stress against the shear rate for a fixed initial concentration of EG and PG Xi=24% and for ice fractions ranging from 5% to 85%. It is observed that the shear stress increased with the shear rate for each case. As expected, the experimental rheograms obtained show that the ice slurry exhibits a non-Newtonian behavior, the flow changes from thickening to shear thinning as the ice fraction increases confirming previous results of [13]-[15]. It is also noticed that when the additive concentration is equal to 24%, the ice slurry behaves similarly to a Newtonian fluid at low ice concentrations.

III. RHEOLOGICAL MEASUREMENTS

All measurements are performed under steady state conditions to enable to deduce the most appropriate rheological law describing the viscous behavior of ice slurries. Note that the elastic component of ice slurries is negligible.

For the viscous behavior, choosing the appropriate rheological model is an important step before describing the ice slurry behavior. Niezgoda-Żelasko and Zalewski [4] proposed to focus on the Herschel-Bulkley fluid model to...
describe the ice slurry behavior. This three-parameter model links the shear rate \((\dot{\gamma}, \text{s}^{-1})\) to the shear stress \((\tau, \text{Pa})\) as:

\[
\tau = \tau_0 + k \dot{\gamma}^n
\]  

(1)

where \(\tau_0\) is the yield stress (Pa), \(k\) is the consistency index (Pa·s\(^n\)) and \(n\) is the flow index.

In order to determine the coefficients \(k\) and \(n\), experimental results were post-processed using the least squared method. The method has been applied for both additives PG and EG and three additive concentrations, namely 5%, 14% and 24% even if measurements with the 24% additive concentration are represented in the next section. Ice mass fraction varies from 5% to 85%.

The present results provide a correlation for the flow index, \(n(X_s,X_i)\), as a function of the initial PG and EG concentrations for \(X_i=24\%\) and ice mass fractions, \(X_s\), ranging from 5 to 85%.

\(n(X_s,X_i = 24\%) = 0.7783e^{-0.357X_s} + 0.002465e^{-2.31X_s}\)  

(3)

For both additives at \(X_i=24\%\), the ice slurry exhibits mainly a shear thinning behavior up to \(X_s=70\%\) and then a shear-thickening behavior is observed at higher ice fractions.

Fig. 8 shows the variation of the consistency \(k\) as a function of ice fraction for \(X_i=24\%\) of PG. The HB model and the least square approach provides the correlation \((R^2=0.99)\):

\(k(X_s,X_i = 24\%) = 5.945 \times 10^{-15}e^{41.06X_s} + 1.202e^{-0.3532X_s}\)  

(4)

The yield stress is calculated using the experimental rheograms shown by extrapolating the rheograms at very low shear rates. The results are not shown here but will be used in the ANN model.

IV. ARTIFICIAL NEURAL NETWORK MODEL

This section presents an Artificial Neural Networks model (ANN model) used to predict the rheological characteristics of ice slurries. In order to construct this model, an experimental database is established from the present results and also from experimental data reported in the literature [15], [16] and our experimental results are used to train and test the ANN model.

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(4)

Fig. 9 shows the variation of the consistency \(k\) as a function of ice fraction for \(X_i=24\%\) of EG. The HB model and the least square approach provides the correlation \((R^2=0.98)\):

\(k(X_s,X_i = 24\%) = 8.067 \times 10^{-10}e^{21.92X_s} + 1.165e^{-0.3344X_s}\)  

(5)

The yield stress is calculated using the experimental rheograms shown by extrapolating the rheograms at very low shear rates. The results are not shown here but will be used in the ANN model.

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for a total number of 460 different experimental data. Five input parameters are employed: Type of additive (EG or PG), additive concentration, ice fraction, ice slurry temperature and shear rate. The shear stress was selected as the output parameter and so is predicted by the ANN model [17]-[18].

Table I summarizes the range of values for input and output variables implemented in the ANN model.

<table>
<thead>
<tr>
<th>TABLE I</th>
<th>INPUT AND OUTPUT VARIABLES</th>
</tr>
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<tbody>
<tr>
<td>Parameters</td>
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<tr>
<td>Input variables</td>
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<td>Additive concentration</td>
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<td></td>
<td>Ice fraction</td>
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<td></td>
<td>Shear rate</td>
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<tr>
<td>Output variables</td>
<td>Shear stress</td>
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Table II lists the parameters of the ANN model [18].

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<th>TABLE II</th>
<th>THE PARAMETERS OF THE ANN MODEL [18]</th>
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<td>Parameters</td>
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<td>Learning cycle</td>
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</table>

Fig. 10 shows the correlation between the experimental values and the predicted ANN output for shear rate for training, testing, validation and all data set. This figure illustrates a suitable correlation between the predicted output and experimental data.

Finally, in order to validate the ANN model and improve its performance and precision, additional experimental studies are performed and compared to the ANN model predictions (Figs. 11-13) for Xi=14% PG or EG and two ice fractions Xs=25% or 55%. It is seen that the predictions of ANN model (the output from the ANN model) are generally in very good agreement with the experimental results, showing that ANN model may be a suitable tool to predict the shear stress under different conditions without requiring time consuming experiments.
This paper focused on the influence of the ice concentration at fixed solute concentration (X1=5, 14 and 24%) on ice slurry behavior. First, we have presented the rheological behavior of ice slurries under steady state conditions. The experimental results are given for fixed initial concentrations of PG and EG and ice mass fractions ranging from 5 to 85%. The rheograms showed that the shear stress increased with the mass fraction of ice. A non-Newtonian character of ice slurry was confirmed and its rheological parameters (consistency and flow index) were determined using experimental data. The ice slurry flows is shear thinning (n < 1) or shear thickening (n > 1) depending on the initial additive and ice concentrations. Furthermore, it is seen that the predictions of ANN model are in good agreement with the experimental results.

V. CONCLUSION

This work is part of the NSERC chair on industrial energy efficiency established at Université de Sherbrooke in 2014 with the support of Hydro-Québec, Ressources Naturelles Canada (CanmetEnergy in Varennes) and Rio Tinto Alcan that are gratefully acknowledged. S. Trabelsi would also like to thank Dr. Mohamed Hafid for many insightful discussions regarding Inverse Methods and Artificial Neural Networks method.

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REFERENCES