

Shiraz University School of Mechanical Engineering

# Ph.D. Thesis In Mechanical Engineering

# ANALYSIS OF FROST FORMATION OVER A HORIZONTAL CYLINDER BY NATURAL CONVECTION

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October 2009







the compassionate the merciful

#### IN THE NAME OF GOD

#### ANALYSIS OF FROST FORMATION OVER A HORIZONTAL CYLINDER BY NATURAL CONVECTION

BY

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#### THESIS

#### SUBMITTED TO THE SCHOOL OF GRADUATE STUDIES IN PARTIAL FULFILLMENT OF THE REQUIREMENTS FOR THE DEGREE OF DOCTOR OF PHILOSOPHY (Ph.D.)

IN

#### MECHANICAL ENGINEERING – ENERGY CONVERSION SHIRAZ UNIVERSITY SHIRAZ ISLAMIC REPUBLIC OF IRAN

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October 2009

Dedicated to my parents, *Mohammad Reza* and *Roya*, the legends of patience and sacrifice

Dedicated to my brother, *Amid*, my great supporter in life

without their support, this document would not exist

and

Dedicated to my wife, *Negar*, who has brought a new level of love into my life

#### ACKNOWLEDGEMENT

First, all praise is due to Almighty GOD for keeping me in a good health and conditions, and for attending upon the successful completion of his work. I am indebted to his supremacy and his blessings in every single step of my life.

I would like to express my sincere thanks and appreciation to Prof. Dr. Mahmood Yaghoubi who has kindly accepted the responsibility of being my supervisor. My deepest gratitude to him, I owe the great dept for his thoughts, supports and recommendations, never-ending patience and care, editorial comments, continuous guidance and encouragement, not only in academic pursuits, but in life as general. Thanks a lot, Prof. Yaghoubi, for everything.

I would like to thank Dr. H. Emdad and Dr. A.A. Golneshan, my co-advisors, for their valuable comments and suggestions. My special greetings are extended to them for their great inputs and insights into my research.

I acknowledge to the staffs of Faculty of Mechanical Engineering, Shiraz University for supporting my graduate studies and their helps.

Finally, but definitely not least, I would like to thank my friends, my family and well-wishers for standing next to me.

#### ABSTRACT

# ANALYSIS OF FROST FORMATION OVER A HORIZONTAL CYLINDER BY NATURAL CONVECTION

#### BY ALI REZA TAHAVVOR

Horizontal cylinders are commonly encountered in heat exchangers and evaporators of heat pumps and refrigerators. The frost over such horizontal tubes and pipes influences the system operation and reduces heat transfer between the refrigerant and ambient environment. Design and operation of such systems require a detail understanding of the process of frost formation. From the review of the literatures, it is observed that very few reports about frost formation on horizontal cylinders under natural convection are available. Therefore, in this study attempt will be made to presents a numerical model to simulate frost formation over a horizontal cylinder under natural convection. To carry this task, following steps are considered.

For the first time, soft programming code of Artificial Neural Networks are used to simulate natural convection flow and temperature field around a cold horizontal circular cylinder and a column of horizontal cylinders for different Rayleigh numbers. Very good agreement is found between ANN and CFD schemes and results show that ANN methods can easily be used with remarkable less computational time and cost as compared to CFD methods. Based on a developed computational code, the novel study of transient analysis of the earlystage of frost growth over a horizontal cylinder during natural convection with the assumption of supersaturation effect for the frost formation process is investigated. New experiments are carried out for natural frost formation over a horizontal cylinder and transient model of the fully developed stage of frost growth are developed. Results of numerical simulation are compared with experimental measurements. The agreement between numerical simulation and experimental measurements are excellent. Also, soft programming code of ANN as a new scheme is compared with experimental results for study frost formation around a cold horizontal circular cylinder under natural convection for various cases. This scheme captured the effect of all parameters for frost growth process as much as possible. Finally, based on experimental measurements and numerical results new correlations are proposed for practical applications of cooling and frost growth over cold horizontal cylinder(s).

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