Fighting Spam, Phishing and Email Fraud

A Thesis submitted in partial satisfaction of the requirements for the degree of

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by

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Dreaming big with a drive to excel requires immense motivation and a positive attitude. It takes a lot of courage to follow one’s heart and chase one’s dreams. Great things are never done without hard work and sacrifice.

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With such great blessings and positive energy, a revolution to put an end to the spammers’ business model is in the cards. It begins on the next page...
Fighting Spam, Phishing and Email Fraud

Revolution is in the Cards

SPAM  PHISHING  EMAIL FRAUD