

USING TIME SERIES MODELS FOR DEFECT PREDICTION
IN SOFTWARE RELEASE PLANNING

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James W. Tunnell

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Graduate Studies

We hereby approve the thesis of

James W. Tunnell

Candidate for the degree of Master of Science

APPROVED FOR THE GRADUATE FACULTY

Dr. John K. Anvik, Committee Chair

Dr. Yvonne Chueh

Dr. Kathryn Temple

Dean of Graduate Studies

ABSTRACT

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James W. Tunnell

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To produce a high-quality software release, sufficient time should be allowed for testing and fixing defects. Otherwise, there is a risk of slip in the development schedule and/or software quality. A time series model is used to predict the number of bugs created during development. The model depends on the previous numbers of bugs created. The model also depends, in an exogenous manner, on the previous numbers of new features resolved and improvements resolved. This model structure would allow hypothetical release plans to be compared by assessing their predicted impact on testing and defect-fixing time. The VARX time series model was selected as a reasonable approach. The accuracy of the model varies for different sampling periods, window sizes, and degree of differencing.

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