## University of California Los Angeles

# Tocorime Apicu: Design of an Experimental Search Engine Using an Information Sharing Model

A dissertation submitted in partial satisfaction of the requirements for the degree Doctor of Philosophy in Computer Science

by

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To my mother, father, grandparents, and my biological lineage—people of Gullah descendant—
for the courage and fortitude needed to accomplish this goal

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# Publications

R.L. Walker. "Simulating an Information Ecosystem within the WWW," in *Soft Computing Systems: Design, Management and Applications*, IOS Press. December 2002.

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