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The Baldwin Effect: A Bibliography

Last updated: Jan. 2007

Latest news

- Two papers were added (Apr. 2007).
 - One paper was added (Jan. 2007).
 - One paper was added (Nov. 2006).
 - Three papers were added (Aug. 2006).
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- The papers below are concerned with theoretical and empirical (computational) investigations of the Baldwin effect.
- Any comments, corrections, or additions are [welcome](#).
- Here is the [table of contents](#) for the special issue of [Evolutionary Computation](#) on the Baldwin Effect.
- Here is a very brief [introduction](#) to the Baldwin effect.
- Here is how to handle [PostScript \(.ps\)](#) and [compressed files \(.gz, .Z\)](#).

This page was created by [Peter Turney](#) (.Oct. 1996-), maintained by [Joanna Bryson](#) (Dec. 2001-) and currently maintained by [Reiji Suzuki](#) (Oct. 2003-).

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