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## Structural health monitoring meets data mining

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# Structural Health Monitoring Meets Data Mining

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in 1981

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Cover photos: The Hollandse Brug (bridge) and a Correlation Matrix. The photo of the Hollandse Brug is taken by Gouwenaar, published under the Creative Commons CC0 1.0 Universal Public Domain Dedication; the Correlation Matrix is derived from correlations among 145 signals collected with 145 sensors installed on the Hollandse Brug.

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