

FORTSCHRITT-
BERICHTE

VDI

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**Nonlinear System
Identification Based
on Neural Networks with
Locally Distributed
Dynamics and Application
to Technical Processes**

Reihe **8**: Meß-, Steuerungs-
und Regelungstechnik

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