

**Robust optimization of discrete time systems and periodic
operation with guaranteed stability**

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Abstract

In this thesis an optimization method for nonlinear discrete time systems and periodic operation is presented. The method is particularly suited for engineering problems, as it can obtain an optimal operation point with desired dynamical properties for models with uncertain parameters. In typical applications of the method, technical systems are optimized with respect to economic objectives with nonlinear programming methods, while the desired dynamical properties are ensured with the so-called normal vector constraints. The desired dynamical properties are guaranteed for all operation points in a robustness region around the optimal point.

The normal vector constraints, which are incorporated in the optimization problem, impose the lower bound on the distance between the optimal point and any critical boundary. Typical critical boundaries of interest are stability and feasibility boundaries. The first ones consist of bifurcation points. The second ones involve points at which constraints on output or input variables are violated. Once the locations of the critical points of a system are known, normal vectors on the critical manifolds can be used to measure the distance from the nominal point of operation to stability and feasibility boundaries in the space of the system design parameters. By staying sufficiently far away from all critical manifolds we can guarantee robust stability and feasibility of the system.

Previously the normal vector constraints were applied to the optimization of steady states of continuous-time systems that are modeled by sets of parametrically uncertain differential-algebraic equations. In this thesis the normal vector constraints are developed for fixed points of nonlinear discrete time systems. Such systems frequently arise in engineering applications, either because the model is intrinsically discrete in time, or because the model is the result of a time discretization. Attention is paid to both of these cases. Since stability properties of discrete time systems and periodically operated systems are closely related, the normal vector constraints are considered for the optimization of oscillating models. Note that besides processes, where only oscillating

states occur, there exist models that can be operated periodically or at a steady state. The situation where the normal vector constraints for periodic operation are combined with the case of operation at a steady state is discussed.

The concept of the normal vector constraints is successfully applied to the optimization procedures of supply chains which are modeled as discrete time systems, a fermentation process that results from sampling the continuous time model, and examples of oscillating chemical reactions.

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Notation

The symbols used for particular model descriptions from Chapters 4 and 6 are omitted here. The meaning of these symbols is explained in the corresponding sections together with the model equations.

Roman letters

B	matrix of normal space basis vectors in columns
C	mass matrix of dynamical system with algebraic equations
D	open neighborhood of a point in $\mathbb{R}^{n_x} \times \mathbb{R}^{n_y} \times \mathbb{R}^{n_\alpha}$
d	distance between critical manifold and candidate optimal point
F	dynamical and algebraic system equations
f, \tilde{f}	dynamical system equations
G	normal vector system equations
g	algebraic system equations
\hat{g}	equation defining robustness manifold
h	system constraints
I	identity matrix
i	square root of -1
L	first Lyapunov coefficient
M	has different meaning through the text. If it is used with superscript, than it means a manifold. If it is used with dependency on t , than it is a fundamental matrix solution of differential equation. The special case of it $M(T)$ is called a monodromy matrix.
m	rate of uncertainty hypersquare approximation
n_h	number of system constraints
n_x	number of dynamic state variables
n_y	number of algebraic state variables

n_z	number of dynamic and algebraic state variables
n_α	number of uncertain parameters
P	Poincaré map
p	vector of initial conditions, period, and parameters for periodic orbits
Q	open neighborhood of a point in $\mathbb{R}^{n_x} \times \mathbb{R}^{n_\alpha}$
q	vector of state variables and parameters for equilibria
R	radius of circle in complex plane
r	normal vector
s	phase condition
T	period
t	time
U	open neighborhood of a point in \mathbb{R}^{n_x}
u	auxiliary variable in normal vector systems
V	open neighborhood of a point in \mathbb{R}^{n_y}
v	eigenvector
\hat{v}	generalized eigenvector
W	open neighborhood of a point in \mathbb{R}^{n_α}
w	eigenvector
\hat{w}	generalized eigenvector
x	vector of dynamic state variables
\bar{x}	vector of auxiliary variables in normal vector systems
y	vector of algebraic state variables
z	vector of dynamic and algebraic state variables
\bar{z}	vector of auxiliary variables in normal vector systems

Greek letters

α	vector of uncertain parameters
γ	auxiliary variable in normal vector systems
$\Delta\alpha_i$	uncertainty of parameter α_i
Δt	discretization step-size
ζ	local coordinates on Poincaré section
η	number of continuous derivatives
θ	argument of complex number

κ	linear combination of normal space basis vectors
\varkappa	auxiliary variable in normal vector systems
λ	eigenvalue
$\bar{\lambda}$	complex conjugate of λ
$\hat{\lambda}$	generalized eigenvalue
ξ	local solution for algebraic variables
Σ	Poincaré section
τ	time delay
Φ_0	periodic orbit
ϕ	objective function
$\varphi, \tilde{\varphi}$	flow of differential equation
ω	imaginary part of complex number

Calligraphic letters

\mathcal{I}	set of normal vector constraints to critical equilibria and fixed points
\mathcal{J}	set of normal vector constraints to critical periodic solutions
\mathcal{L}	set of close critical points

Mathematical notation

\mathbb{C}	complex numbers
dist	Euclidean distance
inf	infimum
\mathbb{N}	natural numbers
∇	gradient
\mathbb{R}	real numbers
\mathbb{R}^+	positive real numbers
Range	range of a matrix (column space)
Rank	rank of a matrix
Re	real part of a complex number
$\ \cdot \ $	Euclidean norm
$\langle \cdot, \cdot \rangle$	scalar product
\forall	for all

- \subset subset of
- \cup union of sets

Subscript

- i, j, k index variable
- max maximum value
- min minimum value
- 0 initial value

Superscript

- c critical point
- end resulting point of optimization procedure
- i, \hat{i}, j, k index variable
- \widetilde{flip} flip bifurcation point
- \widetilde{flip} modified flip point
- \widetilde{fold} fold bifurcation point
- \widetilde{fold} modified fold point
- Hopf Hopf bifurcation point
- NS Neimark-Sacker bifurcation point
- \widetilde{NS} modified Neimark-Sacker point
- rob robustness
- sn saddle-node bifurcation point
- $start$ initial point of optimization procedure
- T transposition
- 0 nominal point

Abbreviations

- APIOBPCS automatic pipeline, inventory and order based production control system
- CSTR continuously stirred-tank reactor
- DDE delay differential equation
- NLP nonlinear program

ODE	ordinary differential equation
SQP	sequential quadratic programming
VMI	vendor managed inventory

Derivatives

We assume that subscripts μ and ν enumerate rows and columns, respectively. Note that, for example, in x_μ , μ runs from 1 to n_x , whereas in α_μ , $\mu = 1, \dots, n_\alpha$. In the thesis the following notations for derivatives are used

$$\begin{aligned}
 (F_z)_{\mu\nu} &= \frac{\partial F_\mu}{\partial z_\nu}, & (F_\alpha)_{\mu\nu} &= \frac{\partial F_\mu}{\partial \alpha_\nu}, \\
 (F_{zz}\hat{w})_{\mu\nu} &= \sum_{\rho=1}^{n_z} \frac{\partial^2 F_\mu}{\partial z_\nu \partial z_\rho} \hat{w}_\rho, & (F_{z\alpha}\hat{w})_{\mu\nu} &= \sum_{\rho=1}^{n_z} \frac{\partial^2 F_\mu}{\partial \alpha_\nu \partial z_\rho} \hat{w}_\rho, \\
 (\hat{v}^T F_{zz}\hat{w})_\mu &= \sum_{\rho,\sigma=1}^{n_z} \hat{v}_\rho \frac{\partial^2 F_\rho}{\partial z_\mu \partial z_\sigma} \hat{w}_\sigma, & (\hat{v}^T F_{z\alpha}\hat{w})_\mu &= \sum_{\rho,\sigma=1}^{n_z} \hat{v}_\rho \frac{\partial^2 F_\rho}{\partial \alpha_\mu \partial z_\sigma} \hat{w}_\sigma, \\
 (\varphi_{x_0})_{\mu\nu} &= \frac{\partial \varphi_\mu}{\partial x_{0\nu}}, & (\varphi_\alpha)_{\mu\nu} &= \frac{\partial \varphi_\mu}{\partial \alpha_\nu}, \\
 (\varphi_T)_\mu &= \frac{\partial \varphi_\mu}{\partial T}, & (\varphi_{x_0\alpha} w)_{\mu\nu} &= \sum_{\rho=1}^{n_x} \frac{\partial^2 \varphi_\mu}{\partial x_{0\nu} \partial x_{0\rho}} w_\rho, \\
 (\varphi_{x_0\alpha} w)_{\mu\nu} &= \sum_{\rho=1}^{n_x} \frac{\partial^2 \varphi_\mu}{\partial \alpha_\nu \partial x_{0\rho}} w_\rho, & (\varphi_{x_0 T} w)_{\mu\nu} &= \sum_{\rho=1}^{n_x} \frac{\partial^2 \varphi_\mu}{\partial T \partial x_{0\rho}} w_\rho, \\
 (v^T \varphi_{x_0 x_0} w)_\mu &= \sum_{\rho,\sigma=1}^{n_x} v_\rho \frac{\partial^2 \varphi_\rho}{\partial x_{0\mu} \partial x_{0\sigma}} w_\sigma, & (v^T \varphi_{x_0 \alpha} w)_\mu &= \sum_{\rho,\sigma=1}^{n_x} v_\rho \frac{\partial^2 \varphi_\rho}{\partial \alpha_\mu \partial x_{0\sigma}} w_\sigma, \\
 v^T \varphi_{x_0 T} w &= \sum_{\rho,\sigma=1}^{n_x} v_\rho \frac{\partial^2 \varphi_\rho}{\partial T \partial x_{0\sigma}} w_\sigma.
 \end{aligned}$$