# **Lecture Notes in Computer Science**

### 12755

#### Founding Editors

Gerhard Goos

Karlsruhe Institute of Technology, Karlsruhe, Germany

Juris Hartmanis

Cornell University, Ithaca, NY, USA

#### **Editorial Board Members**

Elisa Bertino

Purdue University, West Lafayette, IN, USA

Wen Gao

Peking University, Beijing, China

Bernhard Steffen

TU Dortmund University, Dortmund, Germany

Gerhard Woeginger

RWTH Aachen, Aachen, Germany

Moti Yung

Columbia University, New York, NY, USA

More information about this subseries at http://www.springer.com/series/7407

Panos Pardalos · Michael Khachay · Alexander Kazakov (Eds.)

# Mathematical Optimization Theory and Operations Research

20th International Conference, MOTOR 2021 Irkutsk, Russia, July 5–10, 2021 Proceedings



Editors
Panos Pardalos
University of Florida
Gainesville, FL, USA

Alexander Kazakov 
Matrosov Institute for System Dynamics and Control Theory
Irkutsk, Russia

Michael Khachay (1)
Krasovsky Institute of Mathematics and Mechanics
Ekaterinburg, Russia

ISSN 0302-9743 ISSN 1611-3349 (electronic) Lecture Notes in Computer Science ISBN 978-3-030-77875-0 ISBN 978-3-030-77876-7 (eBook) https://doi.org/10.1007/978-3-030-77876-7

LNCS Sublibrary: SL1 - Theoretical Computer Science and General Issues

#### © Springer Nature Switzerland AG 2021

This work is subject to copyright. All rights are reserved by the Publisher, whether the whole or part of the material is concerned, specifically the rights of translation, reprinting, reuse of illustrations, recitation, broadcasting, reproduction on microfilms or in any other physical way, and transmission or information storage and retrieval, electronic adaptation, computer software, or by similar or dissimilar methodology now known or hereafter developed.

The use of general descriptive names, registered names, trademarks, service marks, etc. in this publication does not imply, even in the absence of a specific statement, that such names are exempt from the relevant protective laws and regulations and therefore free for general use.

The publisher, the authors and the editors are safe to assume that the advice and information in this book are believed to be true and accurate at the date of publication. Neither the publisher nor the authors or the editors give a warranty, expressed or implied, with respect to the material contained herein or for any errors or omissions that may have been made. The publisher remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

This Springer imprint is published by the registered company Springer Nature Switzerland AG The registered company address is: Gewerbestrasse 11, 6330 Cham, Switzerland

#### **Preface**

This volume contains the refereed proceedings of the 20th International Conference on Mathematical Optimization Theory and Operations Research (MOTOR 2021)<sup>1</sup> held during July 5–10, 2021, at Lake Baikal, near Irkutsk, Russia.

MOTOR 2021 was the third joint scientific event unifying a number of well-known international and Russian conferences that had been held in Ural, Siberia, and the Far East for a long time:

- The Baikal International Triennial School Seminar on Methods of Optimization and Their Applications (BITSS MOPT) established in 1969 by academician N. N. Moiseev; the 17th event<sup>2</sup> in this series was held in 2017 in Buryatia
- The All-Russian Conference on Mathematical Programming and Applications (MPA) established in 1972 by academician I. I. Eremin; was the 15th conference<sup>3</sup> in this series was held in 2015 near Ekaterinburg
- The International on Discrete Optimization and Operations Research (DOOR) was organized nine times since 1996 and the last event<sup>4</sup> was held in 2016 in Vladivostok
- The International Conference on Optimization Problems and Their Applications (OPTA) was organized regularly in Omsk since 1997 and the 7th event<sup>5</sup> was held in 2018

First two events of this series, MOTOR 2019<sup>6</sup> and MOTOR 2020<sup>7</sup>, were held in Ekaterinburg and Novosibirsk, Russia, respectively.

As per tradition, the main conference scope included, but was not limited to, mathematical programming, bi-level and global optimization, integer programming and combinatorial optimization, approximation algorithms with theoretical guarantees and approximation schemes, heuristics and meta-heuristics, game theory, optimal control, optimization in machine learning and data analysis, and their valuable applications in operations research and economics.

In response to the call for papers, MOTOR 2021 received 181 submissions. Out of 102 full papers considered for reviewing (79 abstracts and short communications were excluded for formal reasons) only 30 papers were selected by the Program Committee (PC) for publication in this volume. Each submission was reviewed by at least three PC members or invited reviewers, experts in their fields, in order to supply detailed and helpful comments. In addition, the PC recommended 34 papers for inclusion in the

<sup>1</sup> https://conference.icc.ru/event/3/.

<sup>&</sup>lt;sup>2</sup> http://isem.irk.ru/conferences/mopt2017/en/index.html.

<sup>&</sup>lt;sup>3</sup> http://mpa.imm.uran.ru/96/en.

<sup>4</sup> http://www.math.nsc.ru/conference/door/2016/.

<sup>&</sup>lt;sup>5</sup> http://opta18.oscsbras.ru/en/.

<sup>6</sup> http://motor2019.uran.ru.

<sup>&</sup>lt;sup>7</sup> http://math.nsc.ru/conference/motor/2020/.

supplementary volume after their presentation and discussion during the conference and subsequent revision with respect to the reviewers' comments.

The conference featured nine invited lectures:

- Dr. Christian Blum (Artificial Intelligence Research Institute, Spain), "On the Design of Matheuristics that make Use of Learning"
- Prof. Emilio Carrizosa (Institute of Mathematics, University of Seville, Spain),
   "Optimal Classification and Regression Trees"
- Prof. François Clautiaux (Université de Bordeaux, France), "Integer Programming Formulations Based on Exponentially Large Networks: Algorithms and Applications"
- Prof. Andreas Griewank (Institute of Mathematics, Humboldt University, Germany), "Beyond Heuristic Gradient Descent in Machine Learning"
- Prof. Klaus Jansen (Christian-Albrechts-Universität, Germany) "Integer Programming and Convolution, with Applications"
- Prof. Sergey Kabanikhin (Institute of Numerical Mathematics and Mathematical Geophysics, Russia) "Optimization and Inverse Problems"
- Prof. Nenad Mladenovic (Khalifa University, United Arab Emirates), "Minimum Sum of Squares Clustering for Big Data – Heuristic Approach"
- Prof. Claudia Sagastizábal (IMECC University of Campinas, Brazil), "Exploiting Structure in Nonsmooth Optimization"
- Prof. Mikhail Solodov (Institute for Pure and Applied Mathematics, Brazil),
   "State-of-the-art on Rates of Convergence and Cost of Iterations of Augmented Lagrangian Methods"

The following three tutorials were given by outstanding scientists:

- Prof. Alexander Gasnikov (Moscow Institute of Physics and Technology, Russia),
   "Reinforcement Learning from the Stochastic Optimization Point of View"
- Prof. Alexander Krylatov (Saint Petersburg State University, Russia), "Equilibrium Traffic Flow Assignment in a Multi-Subnet Urban Road Network"
- Prof. Alexander Strekalovsky (Matrosov Institute for System Dynamics and Control Theory, Irkutsk, Russia), "A Local Search Scheme for the Inequality-Constrained Optimal Control Problem"

We thank the authors for their submissions, the members of the Program Committee (PC), and the external reviewers for their efforts in providing exhaustive reviews. We thank our sponsors and partners: the Mathematical Center in Akademgorodok, Huawei Technologies Co., Ltd., the Sobolev Institute of Mathematics, the Krasovsky Institute of Mathematics and Mechanics, the Ural Mathematical Center, the Center for Research and Education in Mathematics, the Higher School of Economics (Campus Nizhny Novgorod), and the Matrosov Institute for System Dynamics and Control Theory. We are grateful to the colleagues from the Springer LNCS and CCIS editorial boards for their kind and helpful support.

July 2021

Panos Pardalos Michael Khachay Alexander Kazakov

### **Organization**

#### **Program Committee Chairs**

Panos Pardalos University of Florida, USA

Michael Khachay Krasovsky Institute of Mathematics and Mechanics,

Russia

Oleg Khamisov Melentiev Energy Systems Institute, Russia Yury Kochetov Sobolev Institute of Mathematics, Russia Alexander Strekalovsky Matrosov Institute for System Dynamics

and ControlTheory, Russia

#### **Program Committee**

Anatoly Antipin Dorodnicyn Computing Centre of RAS, Russia

Alexander Arguchintsev
Pasquale Avella
Evripidis Bampis
Olga Battaïa

Irkutsk State University, Russia
University of Sannio, Italy
Sorbonne Université, France
ISAE-SUPAERO, France

René van Bevern Novosibirsk State University, Russia Maurizio Boccia University of Naples Federico II, Italy

Sergiy Butenko Texas A&M University, USA

Igor Bychkov Matrosov Institute for System Dynamics

and Control Theory, Russia

Igor Bykadorov Sobolev Institute of Mathematics, Russia
Tatjana Davidović Mathematical Institute of the Serbian Academy

of Sciences and Arts, Serbia

Stephan Dempe Freiberg University, Germany

Gianni Di Pillo University of Rome "La Sapienza", Italy

Alexandre Dolgui IMT Atlantique, France

Mirjam Duer University of Augsburg, Germany

Vladimir Dykhta Matrosov Institute for System Dynamics

and Control Theory, Russia

Rentsen Enkhbat Institute of Mathematics and Digital Technology,

Mongolia

Anton Eremeev Sobolev Institute of Mathematics, Russia Adil Erzin Novosibirsk State University, Russia

Yuri Evtushenko Dorodnicyn Computing Centre of RAS, Russia

Alexander Filatov Far Eastern Federal University, Russia Mikhail Falaleev Irkutsk State University, Russia

Fedor Fomin University of Bergen, Norway

Alexander Gasnikov Moscow Institute of Physics and Technology, Russia

Victor Gergel University of Nizhni Novgorod, Russia

Edward Gimadi Soboley Institute of Mathematics, Russia Aleksander Gornov Matrosov Institute for System Dynamics

and Control Theory, Russia Maastricht University, Netherlands

Feng-Jang Hwang Alexey Izmailov Miloiica Jacimovic

Alexander Grigoriev

Lomonosov Moscow State University, Russia University of Montenegro, Montenegro

University of Technology Sydney, Australia

Klaus Jansen

Kiel University, Germany

Sergey Kabanikhin

Institute of Numerical Mathematics and Mathematical Geophysics, Russia Higher School of Economics, Russia

Valeriy Kalyagin Vadim Kartak Alexander Kazakov

Lev Kazakovtsev

Alexander Kruger

Dmitri Kvasov

Vadim Levit

Igor Konnov

Ufa State Aviation Technical University, Russia

Matrosov Institute of System Dynamics

and ControlTheory, Russia

Siberian State Aerospace University, Russia

Andrey Kibzun Moscow Aviation Institute, Russia Donghyun (David) Kim Kennesaw State University, USA Kazan Federal University, Russia Alexander Kononov

Sobolev Institute of Mathematics, Russia

Federation University, Australia University of Calabria, Italy

Tatyana Levanova Dostoevsky Omsk State University, Russia

Ariel University, Israel

Frank Lewis The University of Texas at Arlington, USA

CNRS. France Leo Liberti

National Chiao Tung University, Taiwan Bertrand M. T. Lin

Marko Makela University of Turku, Finland University of Bologna, Italy Vittorio Maniezzo Pierre Marechal Paul Sabatier University, France

Vladimir Mazalov Institute of Applied Mathematical Research, Russia

Boris Mordukhovich Wayne State University, USA Yury Nikulin University of Turku, Finland

Ivo Nowak Hamburg University of Applied Sciences, Germany

Far Eastern Federal University, Russia Evgeni Nurminski Saint Petersburg State University, Russia Leon Petrosyan

Alex Petunin Ural Federal University, Russia

Boris Polyak Trapeznikov Institute of Control Science, Russia Leonid Popov Krasovsky Institute of Mathematics and Mechanics,

Russia

Mikhail Posypkin Dorodnicyn Computing Centre of RAS, Russia

Oleg Prokopyev University of Pittsburgh, USA

Artem Pyatkin Sobolev Institute of Mathematics, Russia

Soumyendu Raha Indian Institute of Science, India

Alexander Razgulin Lomonosov Moscow State University, Russia Huawei Russian Research Institute, Russia Jie Ren

Anna N. Rettieva Institute of Applied Mathematical Research, Russia

Claudia Sagastizabal Unicamp, Brazil

Yaroslav Sergevev University of Calabria, Italy Natalia Shakhlevich University of Leeds, UK

Moscow Institute of Physics and Technology, Russia Alexander Shananin

Catholic University of Louvain, Belgium Vladimir Shikhman

Angelo Sifaleras University of Macedonia, Greece

Vladimir Skarin Krasovsky Institute of Mathematics and Mechanics.

Russia

Vladimir Srochko Irkutsk State University, Russia Claudio Sterle University of Naples Federico II, Italy Glushkov Institute of Cybernetics, Ukraine Petro Stetsyuk Roman Strongin University of Nizhni Novgorod, Russia

Swinburne University of Technology, Australia Nadia Sukhorukova

University of Aveiro, Portugal Tatiana Tchemisova

Matrosov Institute for System Dynamics Alexander Tolstonogov

> and Control Theory, Russia University of Versailles, France

Vladimir Ushakov Krasovsky Institute of Mathematics and Mechanics,

Russia

Universidad del Valle, Colombia Olga Vasilieva

Alexander Vasin Lomonosov Moscow State University, Russia Vitaly Zhadan Dorodnicyn Computing Centre of RAS, Russia

Huawei Technologies, Co., Ltd., China Dong Zhang

Anatoly Zhigljavsky Cardiff University, UK

Yakov Zinder Sydney Technical University, Australia

#### **Additional Reviewers**

Ider Tseveendori

Abbasov, Majid Berikov, Vladimir Berndt, Sebastian Brinkop, Hauke Buchem, Moritz Buldaev, Alexander Buzdalov, Maxim Chernykh, Ilya Dang, Duc-Cuong Davydov, Ivan Deineko, Vladimir Deppert, Max

Gluschenko, Konstantin

Golak, Julian Gonen, Rica Grage, Kilian Gromova, Ekaterina

Iljev, Victor Jaksic Kruger, Tatjana Khachay, Daniel Khoroshilova, Elena Khutoretskii, Alexandr Kononov, Alexander Kononova, Polina Kovalenko, Yulia Kulachenko, Igor Kumacheva, Suriya Kuzyutin, Denis Lassota, Alexandra Lavlinskii, Sergey Lee, Hunmin Lempert, Anna Melnikov, Andrey

Morshinin, Alexander

Neznakhina, Ekaterina Ogorodnikov, Yuri Orlov, Andrei Pinyagina, Olga Plotnikov, Roman Plyasunov, Alexander Rohwedder, Lars Sandomirskaya, Marina Semenov, Alexander Servakh, Vladimir Sevastyanov, Sergey Shenmaier, Vladimir Shkaberina, Guzel Simanchev, Ruslan Srochko, Vladimir

Stanimirovic, Zorica

Stanovov, Vladimir

#### Organization

Staritsyn, Maxim
Sukhoroslov, Oleg
Tovbis, Elena
Tsidulko, Oxana
Tsoy, Yury

Х

Tur. Anna Tyunin, Nikolay Urazova, Inna Urosevic, Dragan van Lent, Freija

Vasin, Alexandr Veremchuk, Natalia Yanovskaya, Elena Zalyubovskiy, Vyacheslav Zolotykh, Nikolai

#### **Industry Section Chair**

Vasilvev Igor Matrosov Institute for System Dynamics and Control

Theory, Russia

ISDCT SB RAS

ISDCT SB RAS

### **Organizing Committee**

Alexander Kazakov (Chair)	ISDCT SB RAS
Andrei Orlov	ISDCT SB RAS
(D) (C) (1)	

(Deputy Chair)

Tatiana Zarodnyuk

Maxim Zharkov

Tatiana Gruzdeva ISDCT SB RAS

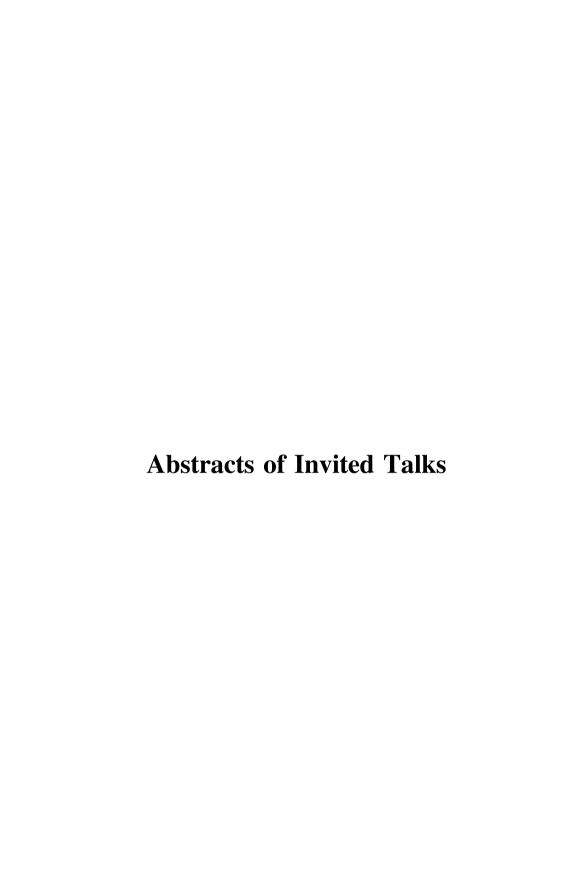
(Scientific Secretary) Vladimir Antonik **IMIT ISU** Maria Barkova ISDCT SB RAS Oleg Khamisov ESI SB RAS Stepan Kochemazov ISDCT SB RAS Polina Kononova IM SB RAS Alexey Kumachev ISDCT SB RAS Pavel Kuznetsov ISDCT SB RAS ISDCT SB RAS Anna Lempert Taras Madzhara ISDCT SB RAS Nadezhda Maltugueva ISDCT SB RAS Ilya Minarchenko ESI SB RAS Ekaterina Neznakhina IMM UB RAS Yuri Ogorodnikov IMM UB RAS Nikolay Pogodaev ISDCT SB RAS Stepan Sorokin ISDCT SB RAS Pavel Sorokovikov ISDCT SB RAS Maxim Staritsyn ISDCT SB RAS Alexander Stolbov ISDCT SB RAS ISDCT SB RAS Anton Ushakov Igor Vasiliev ISDCT SB RAS

#### **Organizers**

Matrosov Institute for System Dynamics and Control Theory, Russia Sobolev Institute of Mathematics, Russia Krasovsky Institute of Mathematics and Mechanics, Russia Higher School of Economics (Campus Nizhny Novgorod), Russia

#### **Sponsors**

Center for Research and Education in Mathematics, Russia Huawei Technologies Co., Ltd. Mathematical Center in Akademgorodok, Russia Ural Mathematical Center, Russia



# On the Design of Matheuristics that make Use of Learning

Christian Blum

Artificial Intelligence Research Institute (IIIA-CSIC), Barcelona, Spain christian.blum@iiia.csic.es

Abstract. Approximation techniques for solving combinatorial optimization problems, such as metaheuristics, often make use of learning. Examples include evolutionary algorithms and ant colony optimization. On the other side, matheuristics — that is, heuristic techniques making use of mathematical programming - rarely include a learning component. Most variants of large neighbourhood search, for instance, do not take profit from learning. In this talk I will present examples of our recent work in which we design matheuristics that make successful use of learning, considering both positive and negative feedback.

**Keywords:** Combinatorial optimization • Approximation • Learning

# **Optimal Classification and Regression Trees**

Emilio Carrizosa

Institute of Mathematics, University of Seville, Spain ecarrizosa@us.es

**Abstract.** Classification and Regression Trees are very powerful Machine Learning tools. Their design expressed as an optimization problem enables us to obtain excellent accuracy performance, and, at the same time, to have some control on important issues such as sparsity, explainability or fairness. In this talk, some recent advances in the field and future research lines will be discussed.

Keywords: Classification • Regression trees

# Integer Programming Formulations Based on Exponentially Large Networks: Algorithms and Applications

François Clautiaux (1)

University of Bordeaux, France francois.clautiaux@math.u-bordeaux.fr

**Abstract.** The last ten years have seen much progress in the field of so-called extended formulations, which aims at reformulating effectively a problem/polyhedron with the help of (exponentially many) additional variables. In particular, network-flow formulations have received an increasing interest from the community. A considerable difficulty to overcome when dealing with such a formulation is to handle its size. In this talk we recall some key results concerning these formulations, and present several recent successful applications that have been obtained using innovative aggregation/disaggregation techniques.

Keywords: Exponential size MIP models • Integer programming

# Beyond Heuristic Gradient Descent in Machine Learning

Andreas Griewank

Institute of Mathematics, Humboldt University, Germany griewank@mathematik.hu-berlin.de

Abstract. In neural network training and other large scale applications, deterministic and stochastic variants of Cauchy's steepest descent method are widely used for the minimization of objectives that are only piecewise smooth. From the classical optimization point of view the roaring and almost exclusive success of this most basic approach is somewhat puzzling. The lack of convergence analysis typically goes along with a large number of method parameters that have to be adjusted by trial and error. We explore several ideas to derive more rigorous but still efficient methods for classification problems. One is a Newton adaptation that can exploit the internal structure of the so-called sparse-max potential, the other a generalization of Wolfe's conjugate gradient method to nonsmooth and nonconvex problems. Our observations and results are demonstrated on the well known MNIST and CIFAR problems with one- and multilayer prediction functions.

Keywords: Neural networks • Conjugate gradient method

# Integer Programming and Convolution, with Applications

Klaus Jansen

Christian-Albrechts-Universität, Kiel, Germany kj@informatik.uni-kiel.de

**Abstract.** Integer programs (IP) with m constraints are solvable in pseudo-polynomial time. We give a new algorithm based on the Steinitz Lemma and dynamic programming with a better pseudo-polynomial running time than previous results. Moreover, we establish a strong connection to the problem (min,+) - convolution. (min,+) - convolution has a trivial quadratic time algorithm and it has been conjectured that this cannot be improved significantly. Finally we show for the feasibility problem also a tight lower bound, which is based on the Strong Exponential Time Hypothesis (SETH), and give some applications for knapsack and scheduling problems. This is joint work with Lars Rohwedder.

**Keywords:** Integer program • Strong exponential time hypothesis • Pseudo-polynomial time

### **Optimization and Inverse Problems**

Sergey Kabanikhin

Institute of Numerical Mathematics and Mathematical Geophysics, Novosibirsk, Russia Ksi52@mai.ru

Abstract. Inverse problems arise in many applications in science and engineering. The term "inverse problem" is generally understood as the problem of finding a specific physical property, or properties, of the medium under investigation, using indirect measurements. In general, an inverse problem aims at recovering the unknown parameters of a physical system which produces the observations and/or measurements. Such problems are usually ill-posed. This is often solved via two approaches: a Bayesian approach which computes a posterior distribution of the models given prior knowledge and the regularized data fitting approach which chooses an optimal model by minimizing an objective taking into account both fitness to data and prior knowledge. Optimization plays an important role in solving many inverse problems. Indeed, the task of inversion often either involves or is fully cast as a solution to an optimization problem. In this talk, we discuss current state-of-the-art optimization methods widely used in inverse problems. We then survey recent related advances in addressing similar challenges in problems faced by the machine learning community and discuss their potential advantages for solving inverse problems.

**Keywords:** Inverse problem • Optimization • Machine learning

# Minimum Sum of Squares Clustering for Big Data – Heuristic Approach

Nenad Mladenovic

Khalifa University, United Arab Emirates nenadmladenovic12@gmail.com

**Abstract.** We first present a review of local search methods that are usually used to solve the minimum sum-of-square clustering (MSSC) problem. We then present some their combinations within Variable neighbourhood descent (VND) scheme. They combine *k*-means, *h*-means and *j*-means heuristics in a nested and sequential way. To show how these local searches can be implemented within a metaheuristic framework, we apply the VND heuristics in the local improvement step of variable neighbourhood search (VNS) procedure. Computational experiments are carried out which suggest that this new and simple application of VNS is comparable to the state of the art. Then we discuss some decomposition and aggregation strategies for solving MSSC problem with huge data sets. Following the recent Less is more approach, the data set is divided randomly into a few smaller subproblems and after solving, the centroids of each subproblem is chosen to represent its cluster for a new aggregation stage. Encouraging computational results on instances of several million entities are presented.

**Keywords:** Minimum sum-of-square clustering • Variable neighbourhood search • Decomposition

# **Exploiting Structure in Nonsmooth Optimization**

Claudia Sagastizábal 10

IMECC - University of Campinas, Brazil sagastiz@unicamp.br

**Abstract.** In many optimization problems nonsmoothness appears in a structured manner. Composite structures are found in LASSO-type problems arising in machine-learning. Separable structures result from applying some decomposition technique to problems that cannot be solved directly. This context is frequent in stochastic programming, bilevel optimization, equilibrium problems. The talk will give a panorama of techniques that have proven successful in exploiting structural properties that are somewhat hidden behind nonsmoothness. Throughout the presentation the emphasis is put on transmitting the main ideas and concepts, illustrating with examples the presented material.

Keywords: Optimization • Structural properties

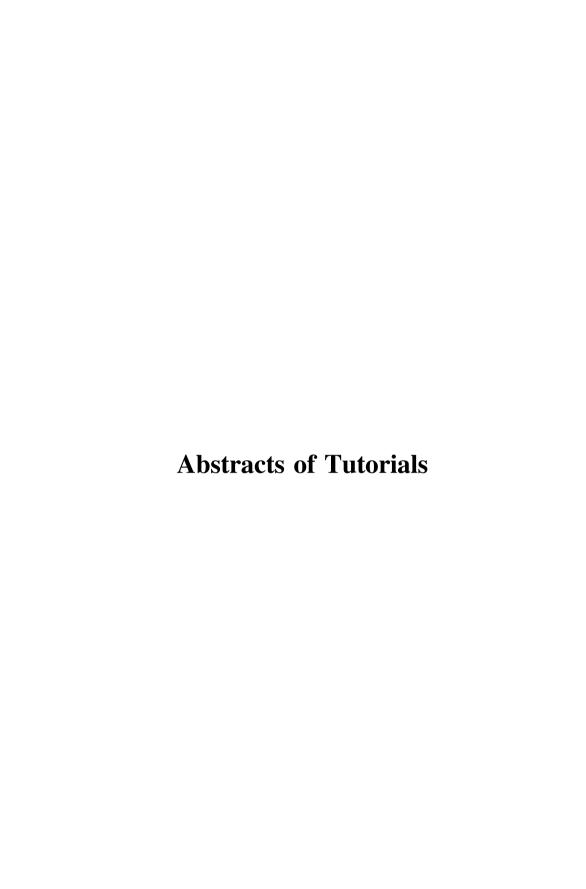
# State-of-the-Art on Rates of Convergence and Cost of Iterations of Augmented Lagrangian Methods

#### Mikhail Solodov

Institute for Pure and Applied Mathematics, Brazil solodov@impa.br

**Abstract.** We discuss state-of-the-art results on local convergence and rate of convergence of the classical augmented Lagrangian algorithm. The local primal-dual linear/superlinear convergence is obtained under the sole assumption that the dual starting point is close to a multiplier satisfying the second-order sufficient optimality condition. In fact, in the equality-constrained case, even the weaker noncriticality assumption is enough. In particular, no constraint qualifications of any kind are needed. Classical literature on the subject required the linear independence constraint qualification (in addition to other things). In addition to the most standard form of the augmented Lagrangian algorithm, the general lines of analysis apply also to its variant with partial penalization of the constraints, to the proximal-point version, and to the modification with smoothing of the max-function. Moreover, we show that to compute suitable approximate solutions of augmented Lagrangian subproblems which ensure the superlinear convergence of the algorithm, it is enough to make just two Newtonian steps (i.e., solve two quadratic programs, or two linear systems in the equality-constrained case). The two quadratic programs are related to stabilized sequential quadratic programming, and to second-order corrections, respectively.

**Keywords:** Convex programming • Augmented Lagrangian methods • Convergence rates



# Reinforcement Learning from the Stochastic Optimization Point of View

#### Alexander Gasnikov

Moscow Institute of Physics and Technology, Russia gasnikov@yandex.ru

**Abstract.** We consider the problem of learning the optimal policy for infinite-horizon Markov decision processes (MDPs). We discuss lower bounds and optimal algorithms for discount and average-reward MDPs with a generative model. We also pay attention to parallelization aspects. In the core of the described approaches lies the idea to relate the problem of learning the optimal policy for MDP with the stochastic optimization algorithms (Mirror Descent type) for optimization reformulations, based on Bellmans' equations (D. Bertsekas).

**Keywords:** Markov decision process • Reinforcement learning • Stochastic optimization

# **Equilibrium Traffic Flow Assignment** in a Multi-subnet Urban Road Network

Alexander Krylatov 10

Saint-Petersburg State University, Russia aykrylatov@yandex.ru

Abstract. Today urban road network of a modern city can include several subnets. Indeed, bus lanes form a transit subnet available only for public vehicles. Toll roads form a subnet, available only for drivers who ready to pay fees for passage. The common aim of developing such subnets is to provide better urban travel conditions for public vehicles and toll-paying drivers. The present paper is devoted to the equilibrium traffic flow assignment problem in a multi-subnet urban road network. We formulate this problem as a non-linear optimization program and prove that its solution corresponds to the equilibrium traffic assignment pattern in a multi-subnet road network. Moreover, we prove that obtained equilibrium traffic assignment pattern guarantees less or equal travel time for public vehicles and toll-paying drivers than experienced by all other vehicles. The findings of the paper contribute to the traffic theory and give fresh managerial insights for traffic engineers.

**Keywords:** Non-linear optimization • Traffic assignment problem • Multi-subnet urban road network

# A Local Search Scheme for the Inequality-Constrained Optimal Control Problem

Alexander Strekalovsky

Matrosov Institute for System Dynamics and Control Theory, Irkutsk, Russiaa strekal@icc.ru

**Abstract.** This paper addresses the nonconvex optimal control (OC) problem with the cost functional and inequality constraint given by the functionals of Bolza. All the functions in the statement of the problem are state-DC, i.e. presented by a difference of the state-convex functions. Meanwhile, the control system is state-linear. Further, with the help of the Exact Penalization Theory we propose the state-DC form of the penalized cost functional and, using the linearization with respect to the basic nonconvexity of the penalized problem, we study the linearized OC problem. On this basis, we develop a general scheme of the special Local Search Method with a varying penalty parameter. Finally, we address the convergence of the proposed scheme.

Keywords: Nonconvex optimal control • DC-functions • Local search

### **Contents**

Т.,	4	$\sim$	T	III zo
	VI		- 12	IKS.

Equilibrium Traffic Flow Assignment in a Multi-subnet Urban	
Road Network	3
A Local Search Scheme for the Inequality-Constrained Optimal Control Problem	17
Combinatorial Optimization	
Serving Rides of Equal Importance for Time-Limited Dial-a-Ride  Barbara M. Anthony, Ananya D. Christman, Christine Chung, and David Yuen	35
Rig Routing with Possible Returns and Stochastic Drilling Times	51
On Asymptotically Optimal Approach for the Problem of Finding Several Edge-Disjoint Spanning Trees of Given Diameter in an Undirected Graph with Random Edge Weights	67
An FPTAS for the △-Modular Multidimensional Knapsack Problem D. V. Gribanov	79
A Column Generation Based Heuristic for a Temporal Bin Packing Problem	96
On Some Variants of the Merging Variables Based (1+1)-Evolutionary Algorithm with Application to MaxSAT Problem	111
Mathematical Programming	
An Approach for Simultaneous Finding of Multiple Efficient Decisions in Multi-objective Optimization Problems	127

Saddle-Point Problems	144
Aleksandr Beznosikov, Vasilii Novitskii, and Alexander Gasnikov	1-1-
Convex Optimization with Inexact Gradients in Hilbert Space and Applications to Elliptic Inverse Problems	159
On the Computational Efficiency of Catalyst Accelerated Coordinate Descent	176
Duality Gap Estimates for a Class of Greedy Optimization Algorithms in Banach Spaces	192
A Penalty Approach to Linear Programs with Many Two-Sided Constraints  Petro Stetsyuk, Andreas Fischer, and Oksana Pichugina	206
Bilevel Optimization	
Sample Approximations of Bilevel Stochastic Programming Problems with Probabilistic and Quantile Criteria	221
On Solving Bilevel Optimization Problems with a Nonconvex Lower Level: The Case of a Bimatrix Game	235
Scheduling Problems	
Two-Machine Routing Open Shop: How Long Is the Optimal Makespan? Ilya Chernykh	253
Minimizing Total Completion Time in Multiprocessor Job Systems with Energy Constraint	267
Maximising the Total Weight of On-Time Jobs on Parallel Machines Subject to a Conflict Graph	280

	Contents	xxxiii
Game Theory and Optimal Control		
Optimal Boundary Control of String Vibrations with Given Shape of Deflection at a Certain Moment of Time		299
A Discrete Game Problem with a Non-convex Terminal Set and a Breakdown in Dynamics		314
Altruistic-Like Equilibrium in a Differential Game of Renewable Resource Extraction		326
Multicriteria Dynamic Games with Random Horizon  Anna Rettieva		340
Feedback Maximum Principle for a Class of Linear Continuity Edinspired by Optimal Impulsive Control	•	356
Nonlocal Optimization Methods for Quadratic Control Systems with Terminal Constraints		369
Identification of the Thermal Conductivity Coefficient of a Substation a Temperature Field in a Three-Dimensional Domain		379
Operational Research and Mathematical Economics		
Dixit-Stiglitz-Krugman Model with Investments in R&D		397
On Contractual Approach for Non-convex Production Economies Valeriy Marakulin		410
Optimization of Regulation and Infrastructure of the Electricity M Alexander Vasin and Olesya Grigoryeva	arket	430
Data Analysis		
Weakly Supervised Regression Using Manifold Regularization and Low-Rank Matrix Representation		447

K-Means Clustering via a Nonconvex Optimization Approach . . . . . . . . .

Tatiana V. Gruzdeva and Anton V. Ushakov

462

#### xxxiv Contents

Machine Learning Algorithms of Relaxation Subgradient Method	
with Space Extension	477
Vladimir N. Krutikov, Vladimir V. Meshechkin, Elena S. Kagan,	
and Lev A. Kazakovtsev	
Author Index	493
Author muck	493