## Оптимизация. Advanced Topics

1. Стохастическая оптимизация. Классическая постановка и способы сэмплирования.

Лекция на основе статей:

- 1) Unified Optimal Analysis of the (Stochastic) Gradient Method
- 2) Stochastic Optimization with Importance Sampling for Regularized Loss Minimization
- 3) SGD: General Analysis and Improved Rates
- 4) <u>A Unified Theory of SGD: Variance Reduction, Sampling, Quantization and</u> Coordinate Descent

Разбор статьи: Random Reshuffling: Simple Analysis with Vast Improvements

2. Стохастическая оптимизация. Методы редукции дисперсии.

Лекция на основе статей:

- SAGA: A Fast Incremental Gradient Method With Support for Non-Strongly Convex Composite Objectives
- 2) <u>Accelerating Stochastic Gradient Descent using Predictive Variance Reduction</u>
- 3) <u>Don't Jump Through Hoops and Remove Those Loops: SVRG and Katyusha are Better Without the Outer Loop</u>
- 4) Katyusha: the first direct acceleration of stochastic gradient methods
- 5) <u>A Unified Theory of SGD: Variance Reduction, Sampling, Quantization and</u> Coordinate Descent

Разбор статьи: <u>SARAH: A Novel Method for Machine Learning Problems Using</u>
Stochastic Recursive Gradient

3. Стохастическая оптимизация. Координатные методы.

Лекция на основе статей:

- Efficiency of Coordinate Descent Methods on Huge-Scale Optimization Problems
- 2) On optimal probabilities in stochastic coordinate descent methods
- 3) Coordinate descent with arbitrary sampling I: algorithms and complexity
- 4) <u>A Unified Theory of SGD: Variance Reduction, Sampling, Quantization and</u> Coordinate Descent

Разбор статьи: SEGA: Variance Reduction via Gradient Sketching

4. Распределенная оптимизация. Сжатие информации. Лекция на основе статей:

1) QSGD: Communication-Efficient SGD via Gradient Quantization and Encoding

- 2) The Error-Feedback Framework: Better Rates for SGD with Delayed Gradients and Compressed Communication
- 3) <u>Distributed Learning with Compressed Gradient Differences</u>
- 4) <u>Acceleration for Compressed Gradient Descent in Distributed and Federated</u>
  Optimization
- 5) MARINA: Faster Non-Convex Distributed Learning with Compression

Разбор статьи: <u>EF21: A New, Simpler, Theoretically Better, and Practically Faster</u> Error Feedback

5. Распределенная оптимизация. Похожесть данных.

Лекция на основе статей:

- Communication-Efficient Distributed Optimization using an Approximate Newton-type Method
- 2) Communication Complexity of Distributed Convex Learning and Optimization
- 3) DiSCO: Distributed Optimization for Self-Concordant Empirical Loss
- 4) <u>Statistically preconditioned accelerated gradient method for distributed optimization</u>

Разбор статьи: Optimal Gradient Sliding and its Application to Optimal Distributed Optimization Under Similarity

- 6. Распределенная оптимизация. Децентрализованные коммуникации. Лекция на основе статей:
  - 1) Collective communication: theory, practice, and experience
  - 2) <u>Distributed average consensus with least-mean-square deviation</u>
  - 3) A Unified Theory of Decentralized SGD with Changing Topology and Local Updates
  - 4) An Improved Analysis of Gradient Tracking for Decentralized Machine Learning
  - 5) Optimal and Practical Algorithms for Smooth and Strongly Convex Decentralized Optimization
  - 6) Lower Bounds and Optimal Algorithms for Smooth and Strongly Convex Decentralized Optimization Over Time-Varying Networks

Разбор статьи: <u>EXTRA: An Exact First-Order Algorithm for Decentralized Consensus Optimization</u>

7. Вариационные неравенства и седловые задачи.

Лекция на основе статей:

- 1) A Variational Inequality Perspective on Generative Adversarial Networks
- 2) On the convergence of single-call stochastic extra-gradient methods
- 3) Solving variational inequalities with stochastic mirror-prox algorithm
- 4) Stochastic Variance Reduction for Variational Inequality Methods
- 5) Revisiting Stochastic Extragradient

Разбор статьи: Extragradient Method: O(1/K) Last-Iterate Convergence for Monotone Variational Inequalities and Connections With Cocoercivity