



2018-12-04

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Logistic Regression Based on Homomorphic Encryption

- Doing Real Work with FHE: The Case of Logistic Regression.
Jack L.H. Crawford, Craig Gentry, Shai Halevi, Daniel Platt, and Victor Shoup.
- Logistic Regression Model Training based on the Approximate Homomorphic Encryption.
Andrey Kim, Yongsoo Song, Miran Kim, Keewoo Lee, and Jung Hee Cheon.
- Logistic regression over encrypted data from fully homomorphic encryption. Hao Chen, Ran Gilad-Bachrach, KyooHyung Han, Zhicong Huang, Amir Jalali, Kim Laine, and Kristin Lauter.
- Privacy-Preserving Logistic Regression Training.
Charlotte Bonte and Frederik Vercauteren.

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- Doing Real Work with FHE: The Case of Logistic Regression.

Jack L.H. Crawford, Craig Gentry, Shai Halevi, Daniel Platt, and Victor Shoup.

Craig Gentry

Shai Halevi, and Victor Shoup. (HElib)

- Homomorphic binary comparisons.
- Unfortunately, our solution was not ready in time for the iDASH competition deadline, so we ended up not participating in the formal competition.

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Gradient Descent:

- Logistic Regression Model Training based on the Approximate Homomorphic Encryption. Andrey Kim, Yongsoo Song, Miran Kim, Keewoo Lee, and Jung Hee Cheon.
- Logistic regression over encrypted data from fully homomorphic encryption. Hao Chen, Ran Gilad-Bachrach, Kyoohyung Han, Zhicong Huang, Amir Jalali, Kim Laine, and Kristin Lauter.

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Logistic Regression Based on Homomorphic Encryption

Gradient Descent:

- Logistic Regression Model Training based on the Approximate Homomorphic Encryption. Andrey Kim, Yongsoo Song, Miran Kim, Keewoo Lee, and Jung Hee Cheon.
- Homomorphic Encryption for Arithmetic of Approximate Numbers. Jung Hee Cheon et al. HEAAN

It supports an approximate addition and multiplication of encrypted messages, together with a new **rescaling** procedure for managing the magnitude of plaintext.

rescaling: it seems similar to the modulus-switching method(Brakerski and Vaikuntanatan)

Logistic Regression: $weights[i] = weights[i] + \alpha \cdot (y_i - sigmoid(z)) \cdot data[i][j]$

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HElib + Logistic Regression

HElib + rescaling 可能性 不可行

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We introduced HEAAN at a workshop for the standardization of HE hosted by Microsoft Research

- Logistic regression over encrypted data from fully homomorphic encryption. Hao Chen, Ran Gilad-Bachrach, Kyoohyung Han, Zhicong Huang, Amir Jalali, Kim Laine, and Kristin Lauter.

We will use $\text{FHE.bscale}(\cdot, i)$ to denote the above bootstrapping plus scaling down by i digits in base p .

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Newton-Raphson

- Privacy-Preserving Logistic Regression Training.

Charlotte Bonte and Frederik Vercauteren.

近似简化 Hessian matrix

近似简化 sigmoid function $\sim 0.5+0.25z$ (is enough to obtain good results.)

2018 iDASH

11/30/2018 Workshop paper submission due (postponed to 12/31, we will send CFP soon)

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