

# Bootstrapping (with Small Error Growth)

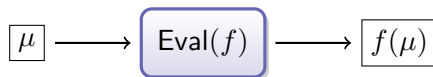
Chris Peikert

University of Michigan

HEAT Summer School  
12 Oct 2015

# Fully Homomorphic Encryption [RAD'78,Gentry'09]

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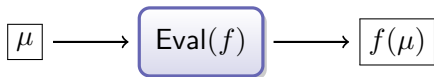
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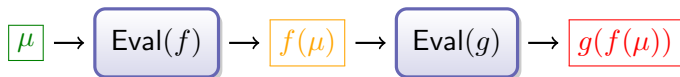


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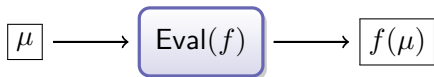
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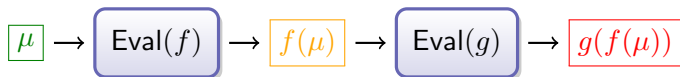


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- ▶ Thus far, “bootstrapping” is required to achieve unbounded FHE.

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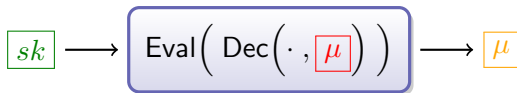
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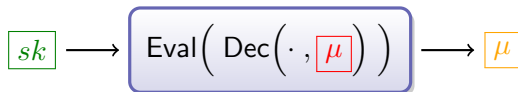
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**Error growth** of  $\text{Eval}(\text{Dec})$  determines strength of cryptographic assumption – e.g., initial LWE noise “rate” of  $\boxed{sk}$ .

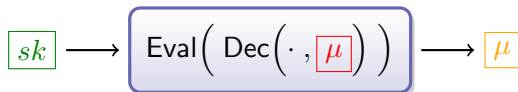
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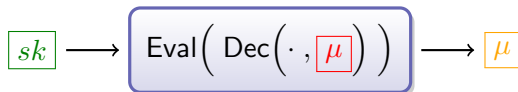
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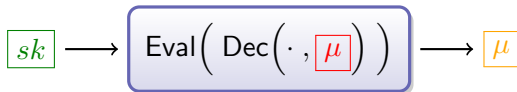
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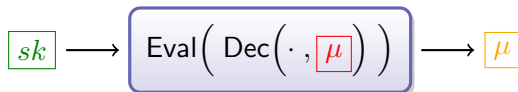
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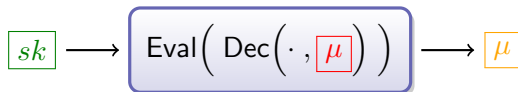
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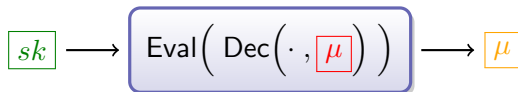
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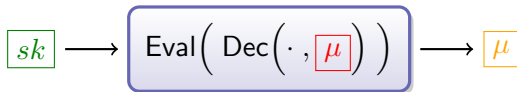


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Can we do better??

# Agenda for the Talk

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- ③ Fast ( $< 1s$ ) ring-based implementation [DucasMicciancio'15]

## Somewhat Homomorphic Encryption [GentrySahaiWaters'13]

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- ▶ (Can **randomize**  $\mathbf{G}^{-1}$  for tighter error growth, full rerandomization.)

## Bootstrapping with Polynomial Error [BrakerskiVaikuntanathan'14]

- ▶ Error growth for multiplication is **asymmetric** and “**quasi-additive**.”

Error in  $\mathbf{C} := \mathbf{C}_1 \square \mathbf{C}_2$  is  $\mathbf{e}_1 \cdot \text{poly}(\lambda) + \mu_1 \cdot \mathbf{e}_2$ .

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- ▶ Generalizes to **orthogonal matrices** over  $\mathbb{Z}$ , e.g., **permutation matrices**.

Encrypt bitwise:

$$\underbrace{\begin{pmatrix} \boxed{0} & \boxed{1} \\ \boxed{1} & \boxed{0} \end{pmatrix}}_{\mathbf{P}_1} \square \underbrace{\begin{pmatrix} \boxed{0} & \boxed{1} \\ \boxed{1} & \boxed{0} \end{pmatrix}}_{\mathbf{P}_2} = \underbrace{\begin{pmatrix} \boxed{1} & \boxed{0} \\ \boxed{0} & \boxed{1} \end{pmatrix}}_{\mathbf{P}_1 \cdot \mathbf{P}_2}$$
$$\underbrace{\begin{pmatrix} \mathbf{e}_{1,1} & \mathbf{e}_{1,2} \\ \mathbf{e}_{2,1} & \mathbf{e}_{2,2} \end{pmatrix}}_{\mathbf{E}}, \underbrace{\begin{pmatrix} \mathbf{f}_{1,1} & \mathbf{f}_{1,2} \\ \mathbf{f}_{2,1} & \mathbf{f}_{2,2} \end{pmatrix}}_{\mathbf{F}} \rightarrow \mathbf{E} \cdot \text{poly}(\lambda) + \underbrace{\begin{pmatrix} \mathbf{f}_{2,1} & \mathbf{f}_{2,2} \\ \mathbf{f}_{1,1} & \mathbf{f}_{1,2} \end{pmatrix}}_{\mathbf{P}_1 \cdot \mathbf{F}}$$

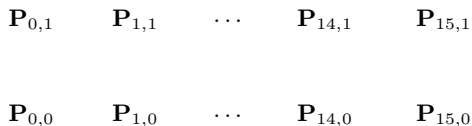
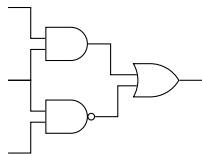
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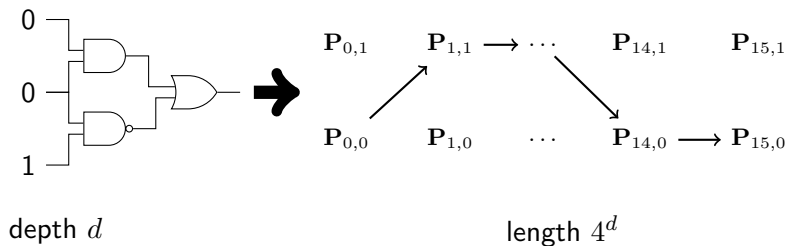


depth  $d$

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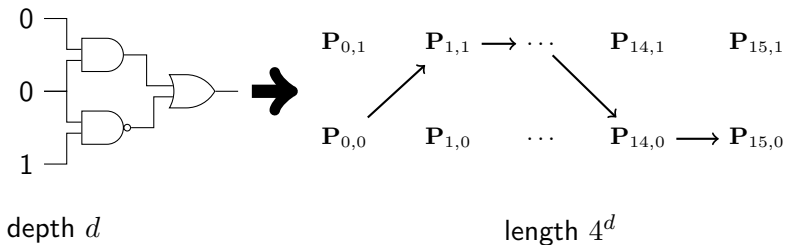
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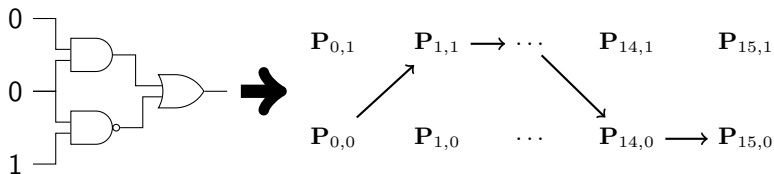
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depth  $d \approx 3 \log \lambda$

length  $4^d \approx \lambda^6$

- ▶ To refresh  $\mu$ : convert  $\text{Dec}(\cdot, \mu)$  to BP; homomorphically evaluate using encrypted bits of  $sk$  to select from pairs  $P_{i,0}, P_{i,1}$ .

✗ Drawback: Barrington's transformation is **very inefficient**.

## More Efficient Bootstrapping [Alperin-SheriffPeikert'14]

- ▶ Faster algorithm with small polynomial error growth

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Avoids Barrington's Theorem – but still uses permutation matrices!
- ▶ Key idea: embed additive group  $(\mathbb{Z}_q, +)$  into a small symmetric group.

## Overview of Bootstrapping Algorithm [AP'14]

- ▶ Decryption in LWE-based schemes is a “rounded inner product:”

$$\text{Dec}(\mathbf{s}, \mathbf{c}) := \lfloor \langle \mathbf{s}, \mathbf{c} \rangle \rfloor_2 \in \{0, 1\} \text{ with } \mathbf{s} \in \mathbb{Z}_q^n, \mathbf{c} \in \{0, 1\}^n$$

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- ▶ It remains to define the group  $G$  and  $\boxplus$ , Equal? operations

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- ▶ Use  $q = p_1 \cdots p_t = \tilde{O}(\lambda)$  for distinct prime  $p_i$ .
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- ▶ FFTW for fast ring operations  $\implies$  bootstrapping in 0.6 sec: FHEW!

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Thanks!