

# Near-optimal Bootstrapping of Hitting Sets

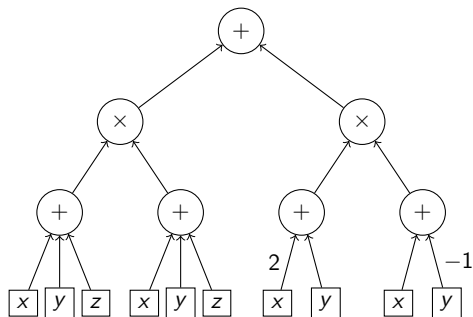
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(Simons Institute)

Ramprasad Saptharishi  
(TIFR)

Anamay Tengse<sup>1</sup>  
(TIFR)

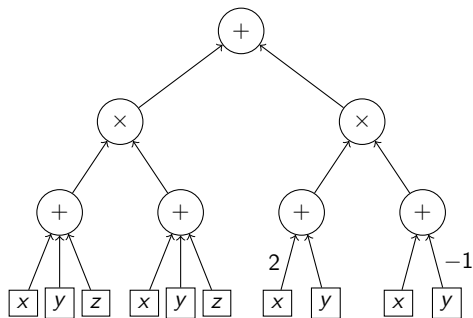
ICTS WACT 2019

# Algebraic Models

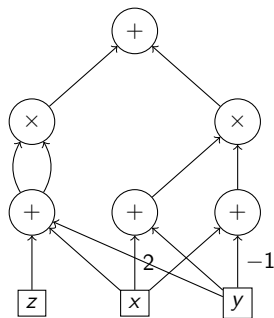


Algebraic Formula

# Algebraic Models



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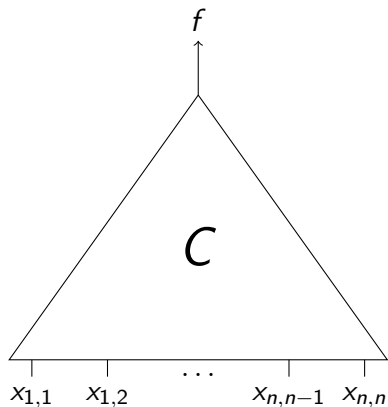


Algebraic Circuit

# The Hardness Question

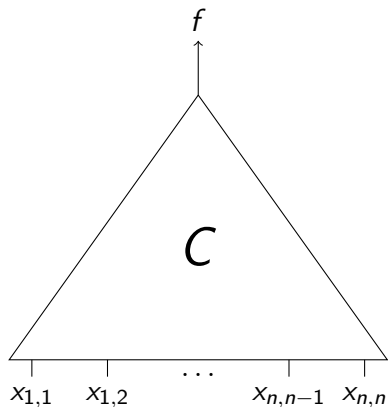
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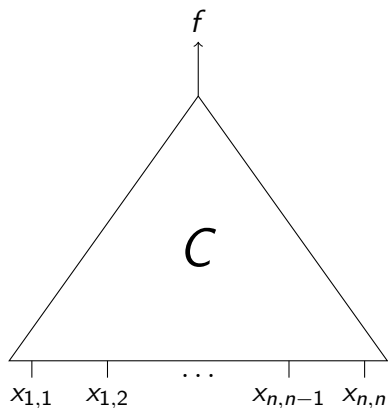
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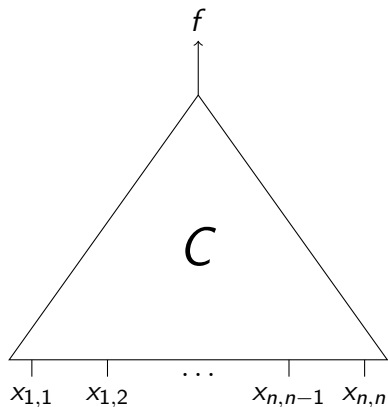


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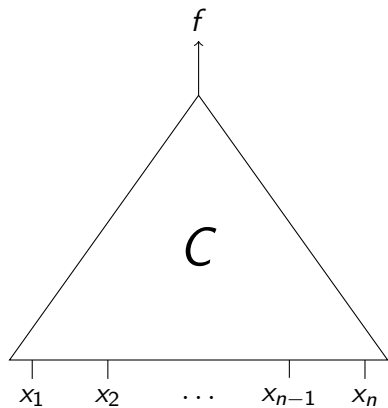
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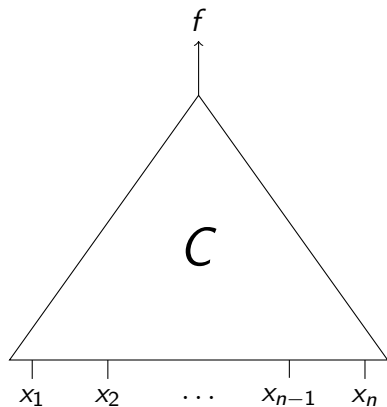
Find an “explicit”  $n$ -variate  $f(\mathbf{x})$  that is hard for circuits? **OPEN**



# Identity Testing

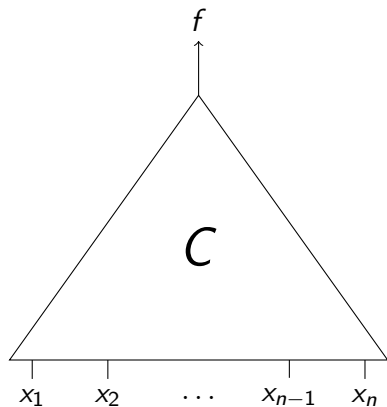


# Identity Testing



Can we say something about  $f$ ?

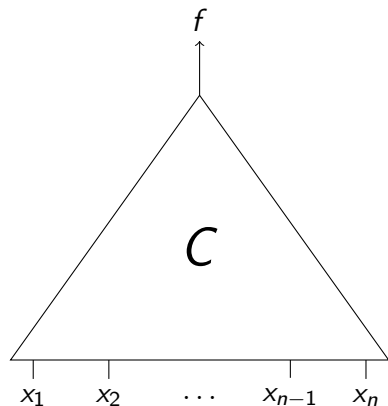
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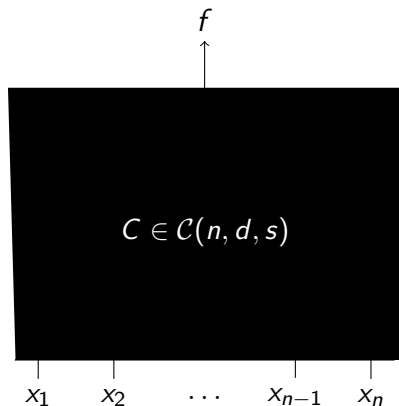


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**Whitebox:** Does the given circuit compute 0?

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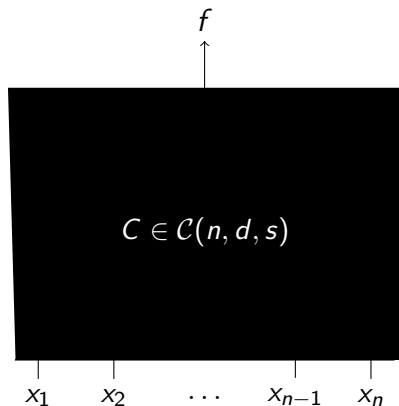


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**Blackbox:** Evaluate  $C$  on some points to tell if  $C = 0$ .

# Identity Testing



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Is  $f = 0$ ?

**Hitting Set:** Find  $H_C$  such that  $C = 0$  **iff** it is 0 on every  $h \in H_C$ .

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**Counting Argument:** There is a **non-explicit**  $\text{poly}(n, d, s)$  sized hitting set for the class of all  $n$ -variate, degree- $d$  circuits of size  $s$ ,  $\mathcal{C}(n, d, s)$ .



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**OPEN:** Find an **explicit** hitting set of size  $d^{o(n)}$  for  $\mathcal{C}(n, d, s)$ .

# Improving slightly non-trivial Hitting Sets

**Theorem** [Agrawal, Ghosh, Saxena 2018]

*Suppose for a large constant  $n$  and all  $s \geq n$ , there is an explicit hitting set of size*

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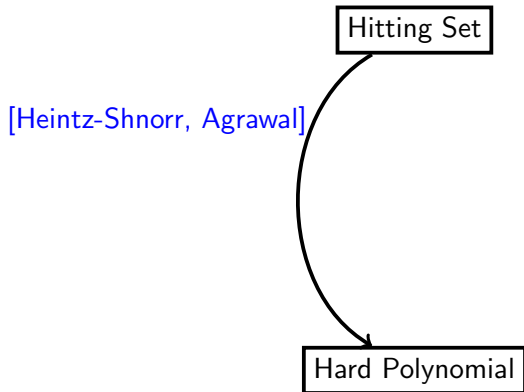
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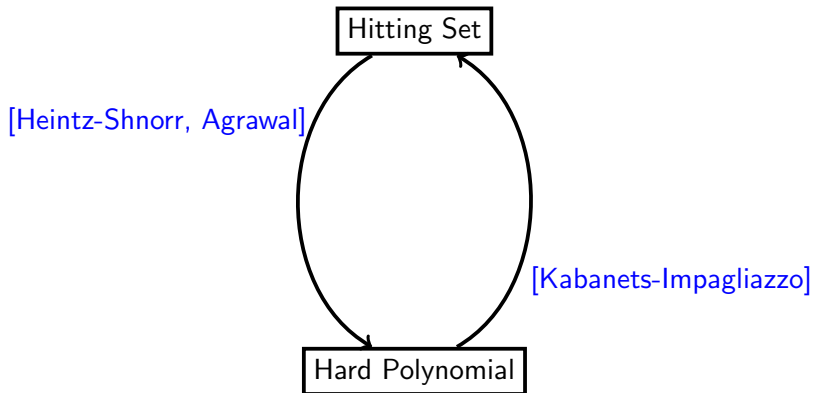
Hitting Set

Hard Polynomial

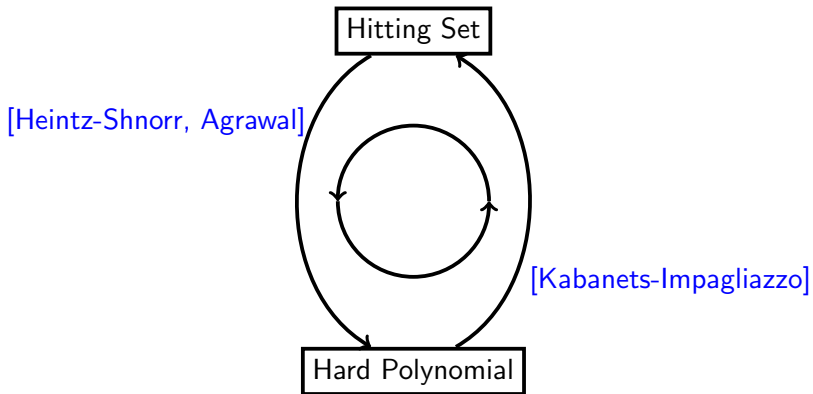
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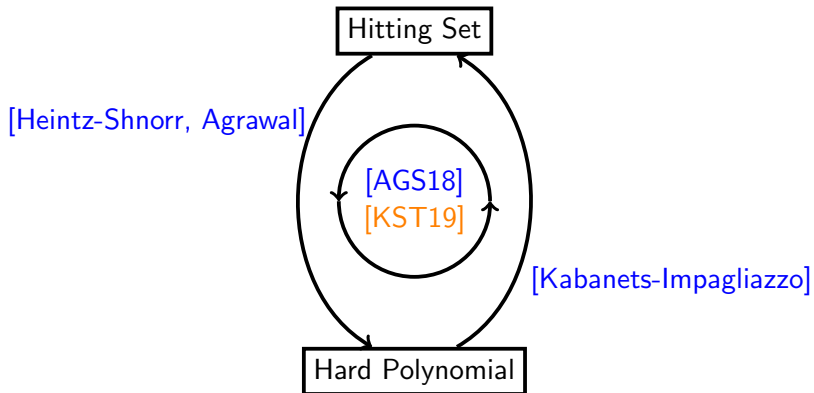
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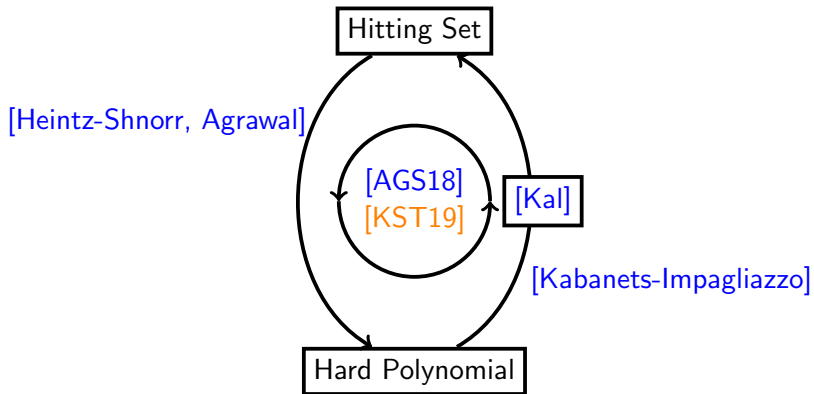


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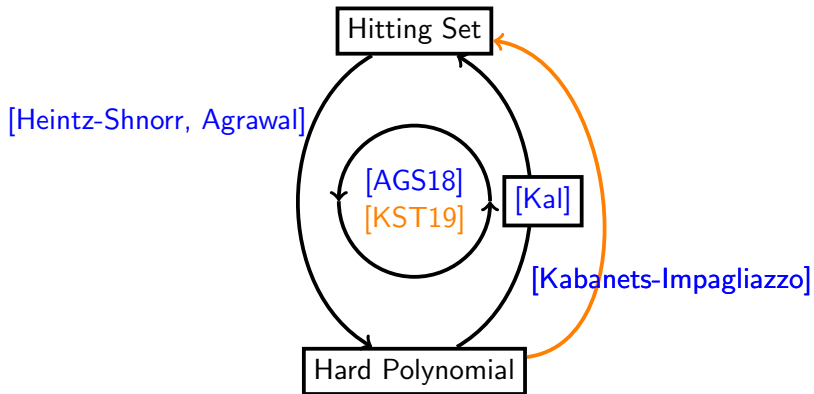




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**Proof Idea:** Use interpolation to get a  $Q_k$  that vanishes on  $H$ .

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when  $\mathbf{y}_1, \dots, \mathbf{y}_m$  are *nearly disjoint*.



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**Outcome:**  $\text{PIT}(m, d, s)$  reduces to  $\text{PIT}(k^2, d', s')$ ,  
for slightly larger  $d', s'$  and  $k \sim \text{polylog}(m)$ .

# Template for Bootstrapping

**On the board!**

# Why can we do this repeatedly?

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Unlike the boolean case, nothing stops us.

# High Level Overview

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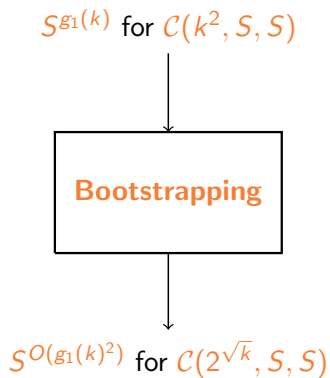
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$S^{g_1(k)}$  for  $C(k^2, S, S)$

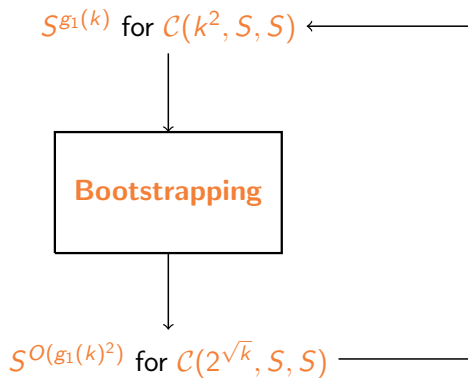


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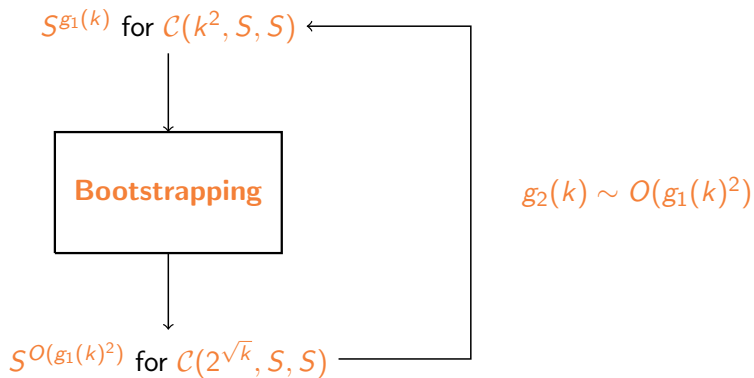


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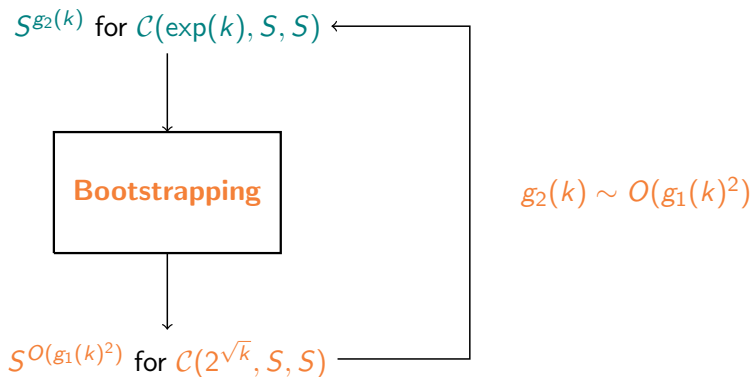




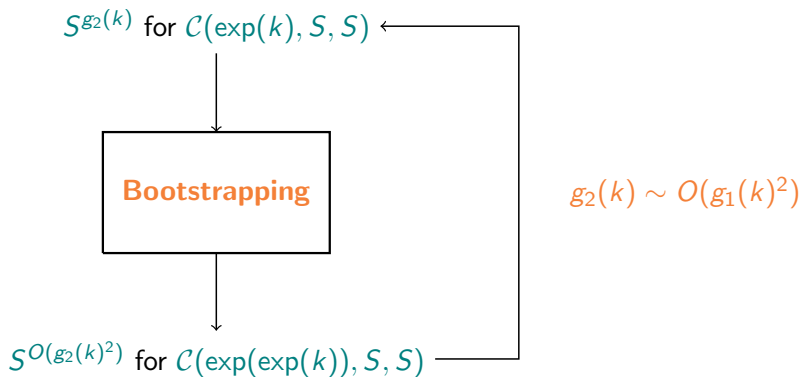
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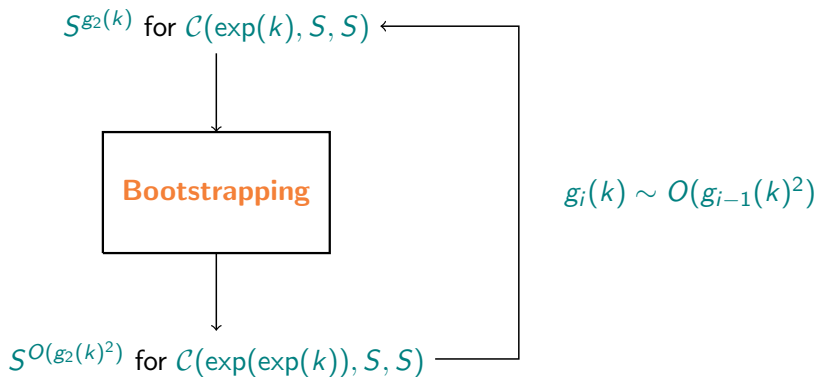
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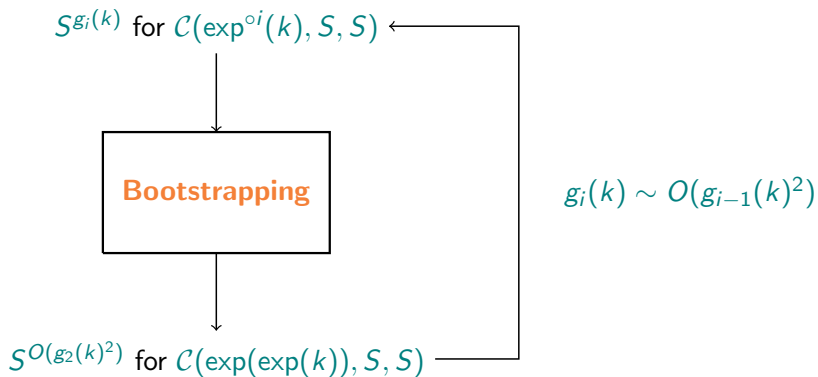
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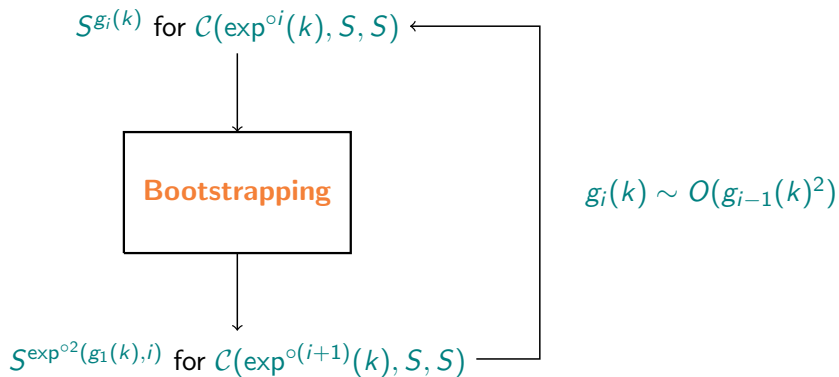
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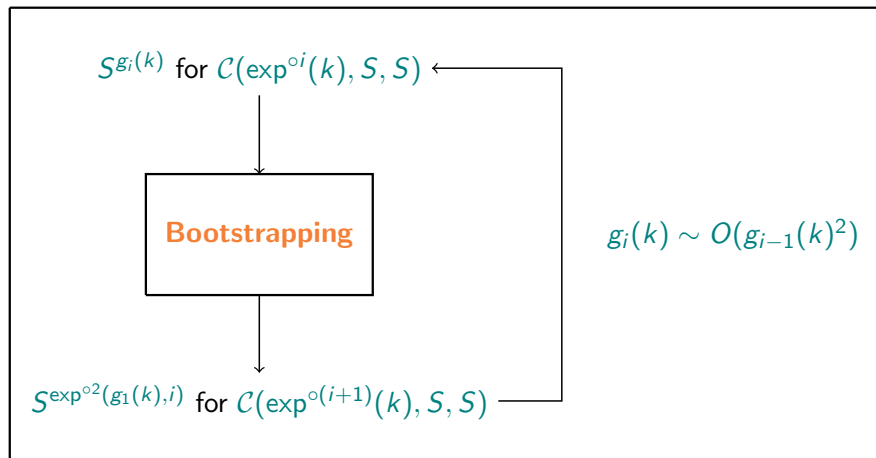
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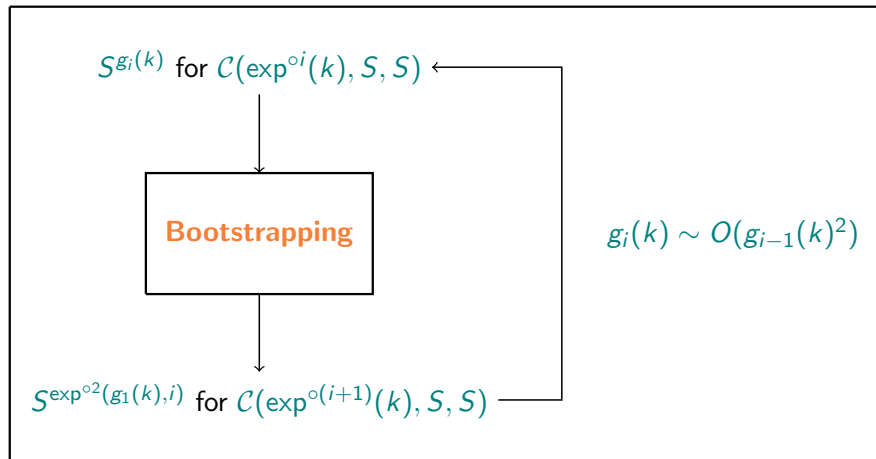


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$$S^{n^{0.2}} \text{ for } \mathcal{C}(n, S, S) \longrightarrow S^{\exp(\exp(O(\log^* S)))} \text{ for } \mathcal{C}(S, S, S)$$





# Summary and Open Questions

**Theorem** [Kumar, Saptharishi, T]

Suppose for a *large constant*  $n$  and *all*  $s \geq n$ , there is an explicit hitting set of size

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# Thank You!