

# Pinocchio: Nearly Practical Verifiable Computation

Bryan Pano, Jon Howell, Craig Gentry, Mariana Raykova

Presentated by      Hui Zhang  
Phd@ECE,UMD      [wayne.huizhang@gmail.com](mailto:wayne.huizhang@gmail.com)

# Introduction

- Outsourcing complex computation to powerful servers is becoming popular.
- However, the workers that help the client to do the job is not always reliable: malicious or malfunctioning workers.
- Previous work has many shortages: impractical time consumption, function specific, not public verification, not zero-knowledge, etc.

# Related works

- **Function specific solutions [2–6] are often efficient, but only for a narrow class of computations. More general solutions often rely on assumptions that may not apply.** For example, systems based on replication [1, 7, 8] assume uncorrelated failures, while those based on Trusted Computing [9–11] or other secure hardware [12–15] assume that physical protections cannot be defeated. **Finally, the theory** community has produced a number of beautiful, general purpose protocols [16–23] that offer compelling asymptotics. **In practice however, because they rely on complex Probabilistically Checkable Proofs (PCPs) [17] or fully-homomorphic encryption (FHE) [24], the performance is unacceptable** –verifying small instances would take hundreds to trillions of years. Very recent work [25–28] has improved these protocols considerably, but efficiency is still problematic, and the protocols **lack features like public verification.**

# Contributions of the paper

1. An end-to-end system for efficiently verifying computation performed by one or more untrusted workers. This includes a compiler that converts “C” code into a format suitable for verification, as well as a suite of tools for running the actual protocol.
- We’ll see how to use the tool later

# Contributions

2. Theoretical and systems-level improvements that bring time down by **5-7** orders of magnitude, and hence into the realm of plausibility. The proof is only **288** bytes, regardless of the computation performed or the size of the inputs and outputs.

3. An evaluation on seven real C applications, showing verification faster than 32-bit native integer execution for **some** apps.

# Background Knowledge

- Verifiable Computation (VC)

*A public verifiable computation (VC) scheme allows a computationally limited client to outsource to a worker the evaluation of a function  $F$  on input  $u$ . The client can then verify the correctness of the returned result  $F(u)$  while performing less work than required for native execution.*

# Public Verifiable Computation

- $(EK_F, VK_F) \leftarrow \text{KeyGen}(F, 1^\lambda)$ :
- $(y, \pi_y) \leftarrow \text{Compute}(EK_F, u)$ :
- $\{0, 1\} \leftarrow \text{Verify}(VK_F, u, y, \pi_y)$ :

# Correctness, Security, Efficiency

- **Correctness** For any function  $F$ , and any input  $u$  to  $F$ , if we run  $(EK_F, VK_F) \leftarrow \text{KeyGen}(F, 1^\lambda)$  and  $(y, \pi_y) \leftarrow \text{Compute}(EK_F, u)$ , then we always get  $1 = \text{Verify}(VK_F, u, y, \pi_y)$ .
- **Security** For any function  $F$  and any probabilistic polynomial-time adversary  $\mathcal{A}$ ,  $\Pr[(\hat{u}, \hat{y}, \hat{\pi}_y) \leftarrow \mathcal{A}(EK_F, VK_F) : F(\hat{u}) \neq \hat{y} \text{ and } 1 = \text{Verify}(VK_F, \hat{u}, \hat{y}, \hat{\pi}_y)] \leq \text{negl}(\lambda)$ .
- **Efficiency** KeyGen is assumed to be a one-time operation whose cost is amortized over many calculations, but we require that Verify is cheaper than evaluating  $F$ .

# Zero-knowledge Verifiable Computation

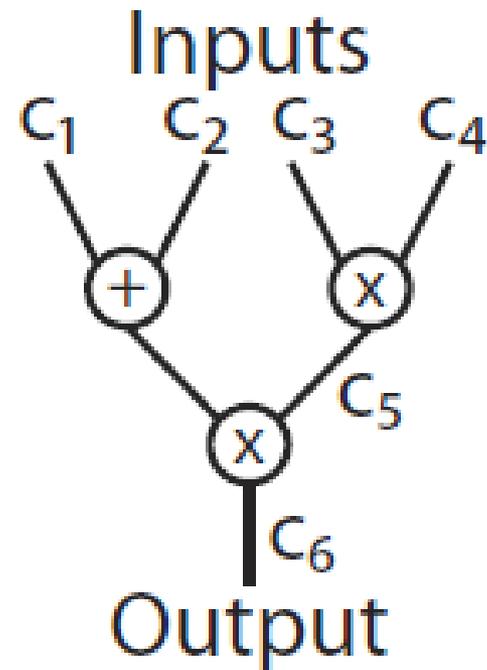
- $F(u;w)$ , of two inputs: the client's input  $u$  and an auxiliary input  $w$  from the worker.
- A VC scheme is zero-knowledge if the client learns nothing about the worker's input beyond the output of the computation

# Quadratic Programs

- GGPR[2] has shown how to compactly encode computations as quadratic programs, so as to obtain efficient VC and zero-knowledge VC scheme.
- Specifically, they show how to convert any arithmetic circuit into a comparably sized QAP, and any Boolean circuit into a comparably sized QSP

# Arithmetic Circuits and QAPs

An arithmetic circuit consists of wires that carry values from a field  $F$  and connect to addition and multiplication gates



# Definition (QAP)

- QAP: an encoding of an Arithmetic Circuit

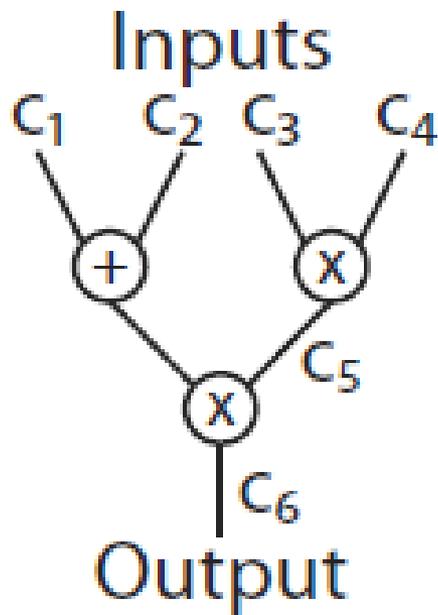
*A QAP  $Q$  over field  $\mathbb{F}$  contains three sets of  $m+1$  polynomials  $\mathcal{V} = \{v_k(x)\}$ ,  $\mathcal{W} = \{w_k(x)\}$ ,  $\mathcal{Y} = \{y_k(x)\}$ , for  $k \in \{0 \dots m\}$ , and a target polynomial  $t(x)$ . Suppose  $F$  is a function that takes as input  $n$  elements of  $\mathbb{F}$  and outputs  $n'$  elements, for a total of  $N = n + n'$  I/O elements. Then we say that  $Q$  computes  $F$  if:  $(c_1, \dots, c_N) \in \mathbb{F}^N$  is a valid assignment of  $F$ 's inputs and outputs, if and only if there exist coefficients  $(c_{N+1}, \dots, c_m)$  such that  $t(x)$  divides  $p(x)$ , where:*

$$p(x) = \left( v_0(x) + \sum_{k=1}^m c_k \cdot v_k(x) \right) \cdot \left( w_0(x) + \sum_{k=1}^m c_k \cdot w_k(x) \right) - \left( y_0(x) + \sum_{k=1}^m c_k \cdot y_k(x) \right) .$$

# Building a QAP

1. Pick an arbitrary root  $r_g \in F$  for each multiplication gate  $g$  in  $C$  and define the target polynomial to be  $t(x) = \prod g (x - r_g)$
2. Associate an index  $k=\{1,2,\dots,m\}$  to each input of the circuit and to each output from a multiplication gate
3. Define three sets  $V, W, Y$ :  $V$  encode left input to each gate,  $W$  encode right input,  $Y$  encode the output

# Building a QAP



	$(r_5, r_6)$		$(r_5, r_6)$		$(r_5, r_6)$
$v_1(r_i)$	(0,1)	$w_1(r_i)$	(0,0)	$y_1(r_i)$	(0,0)
$v_2(r_i)$	(0,1)	$w_2(r_i)$	(0,0)	$y_2(r_i)$	(0,0)
$v_3(r_i)$	(1,0)	$w_3(r_i)$	(0,0)	$y_3(r_i)$	(0,0)
$v_4(r_i)$	(0,0)	$w_4(r_i)$	(1,0)	$y_4(r_i)$	(0,0)
$v_5(r_i)$	(0,0)	$w_5(r_i)$	(0,1)	$y_5(r_i)$	(1,0)
$v_6(r_i)$	(0,0)	$w_6(r_i)$	(0,0)	$y_6(r_i)$	(0,1)

$$t(x) = (x - r_5)(x - r_6)$$

# Boolean Circuits and QSPs

- Boolean circuits operate over bits, with bitwise gates for AND, OR, XOR, etc. GGPR propose Quadratic Span Programs (QSPs) as a custom encoding for Boolean circuits
- QSPs are superficially similar to QAPs, but because they only support Boolean wire values, they use only two sets of polynomials  $V$  and  $W$ .

# Theoretical Refinements

- Originally, we build VC from strong QAPs
- Its main optimization is that we construct a VC scheme that uses a regular QAP, rather than a strong QAP.
- They also remove the need for the worker to compute  $g_{ah}(s)$ , and hence the  $g_{asii2}[d]$  terms from EK. Finally, we expand the expressivity and efficiency of the functions QAPs can compute by designing a number of custom circuit gates for specialized functions.

# Performance

- Proof size: 288-byte, regardless of the size of the computation
- Proof verification: 5~7 orders of magnitude performance improvement over prior work.
- Proof generation: 19-60 x faster.
- Cutting the cost of both key and proof generation by more than 60%.

# Performances

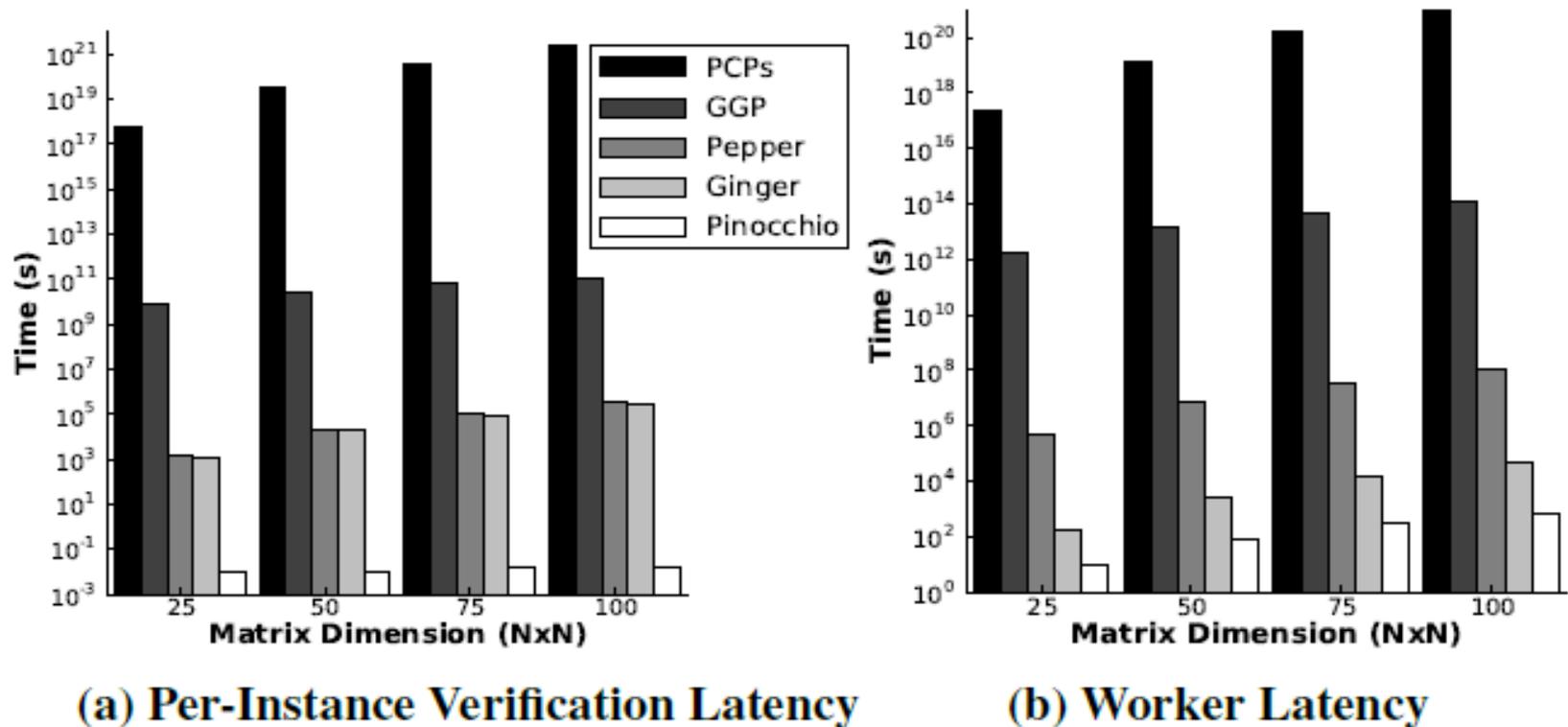
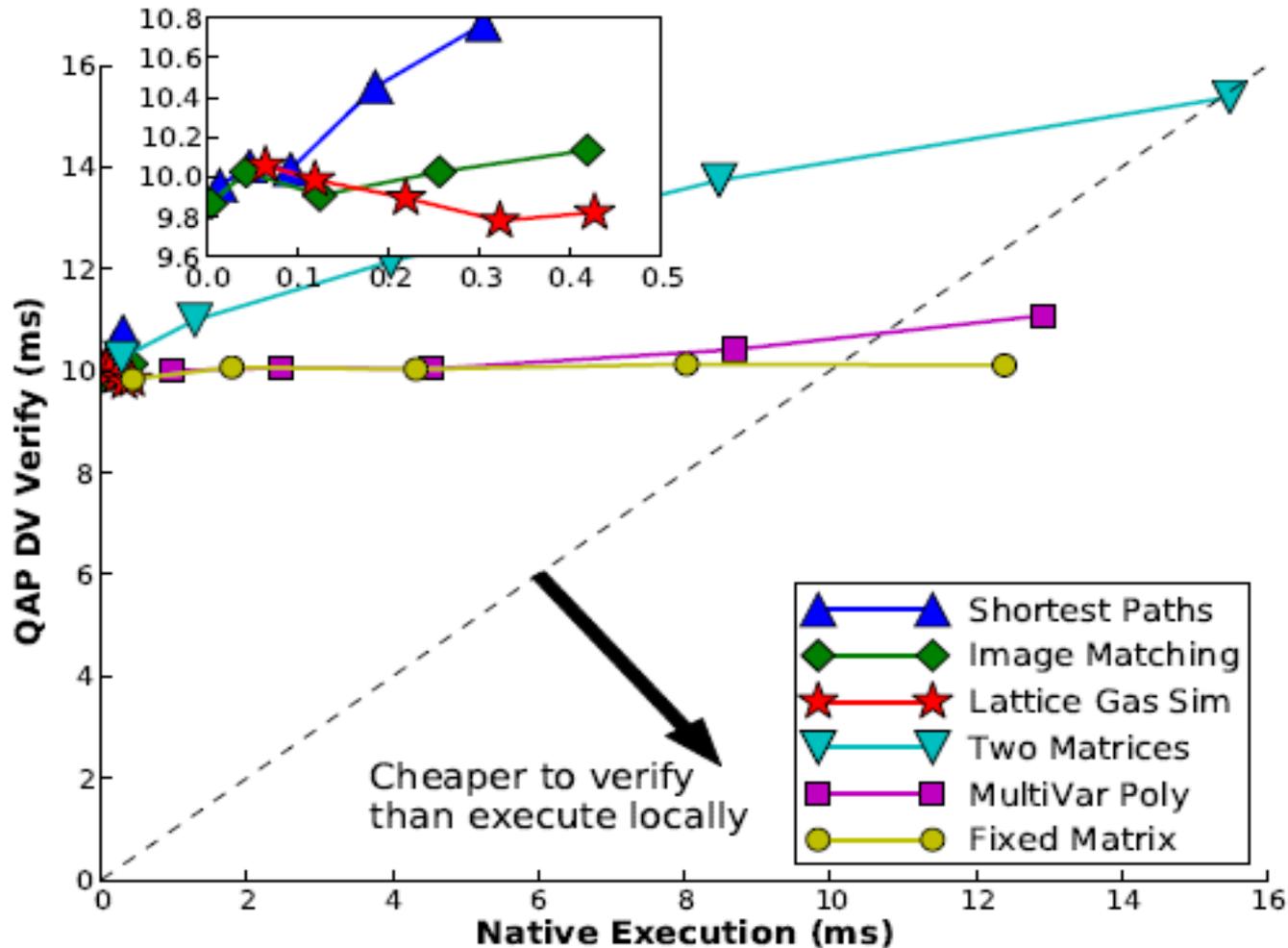
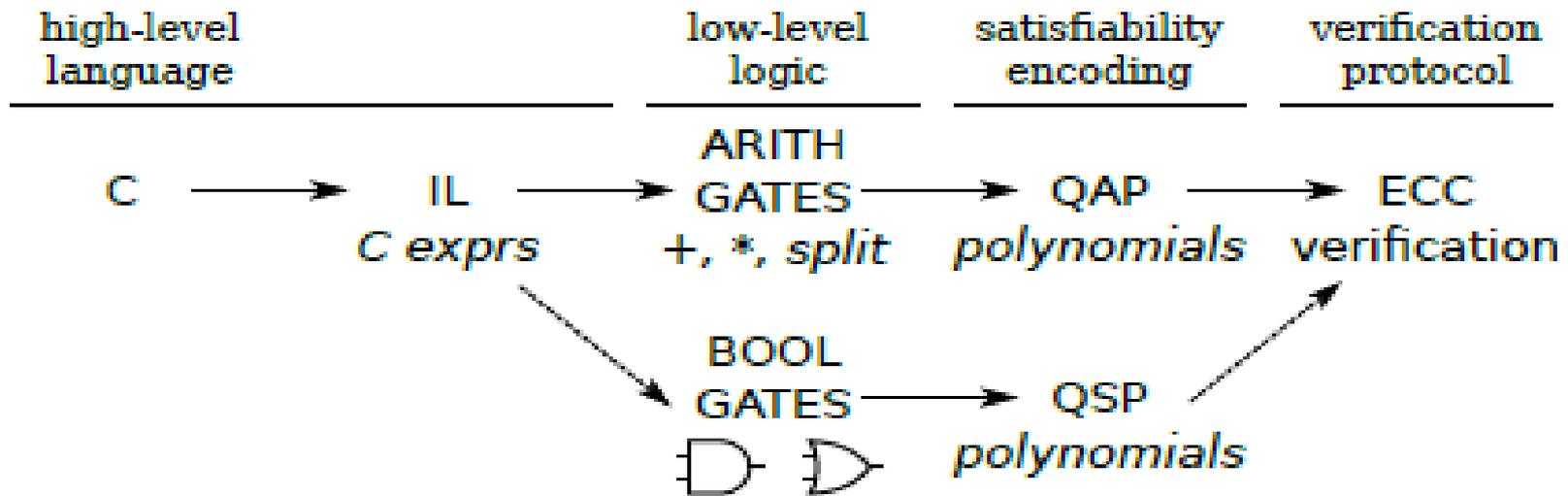


Figure 6: **Performance Relative to Prior Schemes.** *Pinocchio* reduces costs by orders of magnitude (note the log scale on the y-axis). We graph the time necessary to (a) verify and (b) produce a proof result for multiplying two  $N \times N$  matrices.

# Performances



# Tool Usage



**Figure 1: Overview of Pinocchio's Toolchain.** *Pinocchio takes a high-level C program all the way through to a distributed set of executables that run the program in a verified fashion. It supports both arithmetic circuits, via Quadratic Arithmetic Programs (§2.2.1), and Boolean circuits via Quadratic Span Programs (§2.2.2).*

# Steps:

- *First step: Generate a .arith file that describes the circuit you will be operating on.*
  - 1) go to common/ , change corresponding parameters and name of file you want to test in App.py
  - 2) go to ccompiler/input, run ../src/build-test-matrix.py
  - 3) run make -f make.matrix
- *Second step: Run Pinocchio using the arith file obtained from the previous step*
  - pinocchio-v0.4.exe --qap --pv --bits 32 --mem 1 --file /path/to/.arith

**Q&A**

**Thank you !**

# Reference

- [1] Parno, Bryan, et al. "Pinocchio: Nearly practical verifiable computation." *Security and Privacy (SP), 2013 IEEE Symposium on*. IEEE, 2013.
- [2] Gennaro, Rosario, et al. "Quadratic span programs and succinct NIZKs without PCPs." *Advances in Cryptology–EUROCRYPT 2013*. Springer Berlin Heidelberg, 2013. 626-645.