
On the Lindell-Pinkas Secure Computation of Logarithms: From Theory to Practice

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April 26, 2008

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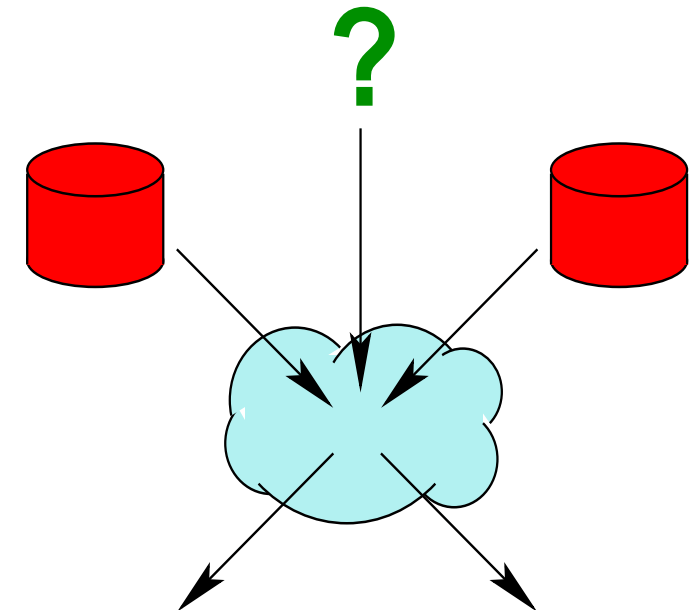
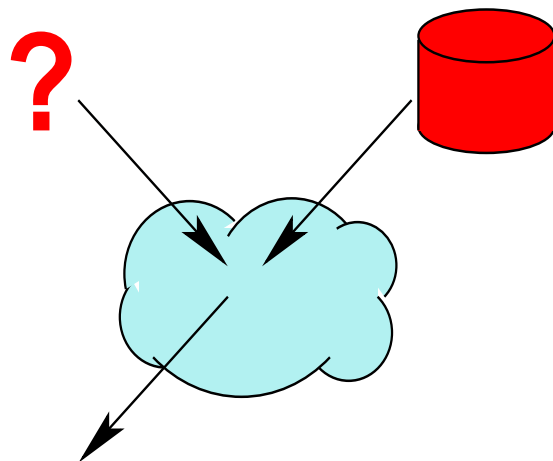
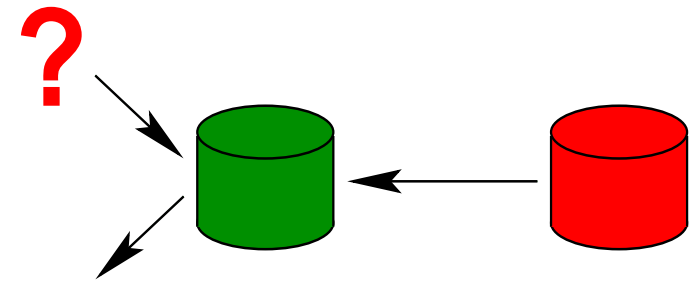
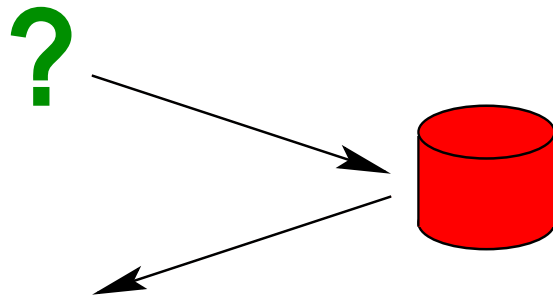
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- PPDM dilemmas:
 - **what data to expose** for analysis;
 - **what analyses to allow.**
- Secure multiparty computation – SMC – theoretically eliminates the former, reducing PPDM to the latter.
- **Generic approaches** to achieving SMC are computationally expensive for non-trivial algorithms and large amounts of input data, making them **impractical for PPDM.**
- Lindell, Pinkas, 2000: A **modular, hybrid** SMC approach, combining building blocks implemented through generic or specialized technologies, can be **practical for PPDM!**
- Lindell, Pinkas, 2000: **Logarithm** computation, an important building block, is itself amenable to this approach.

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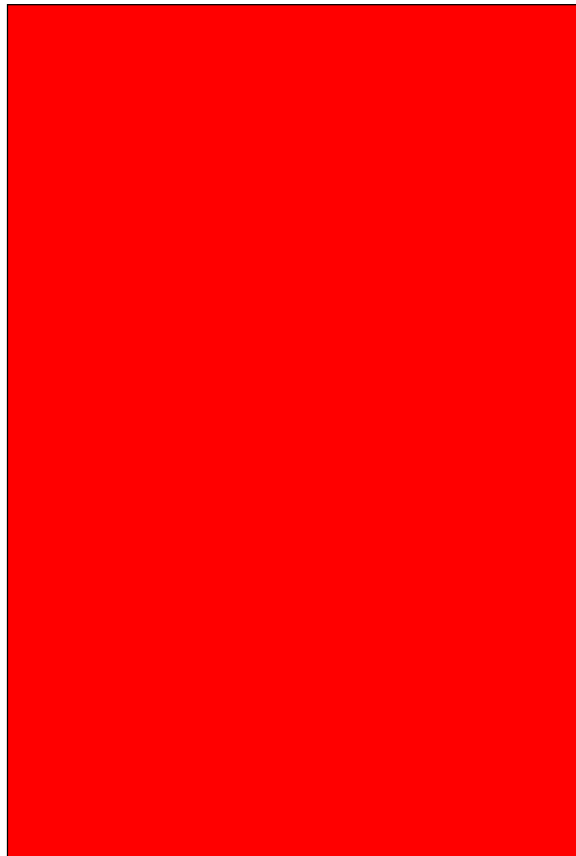
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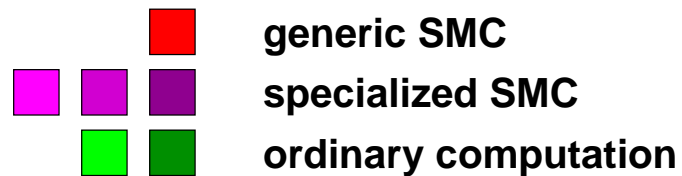
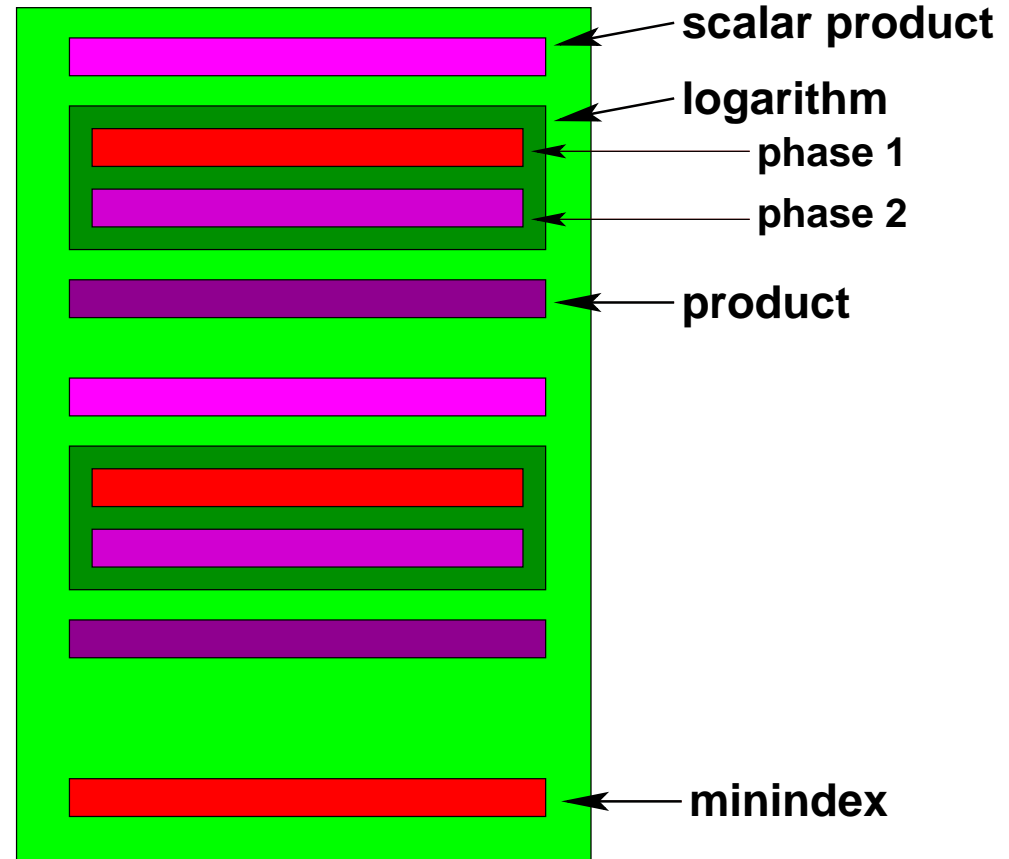
Monolithic vs. modular SMC

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monolithic

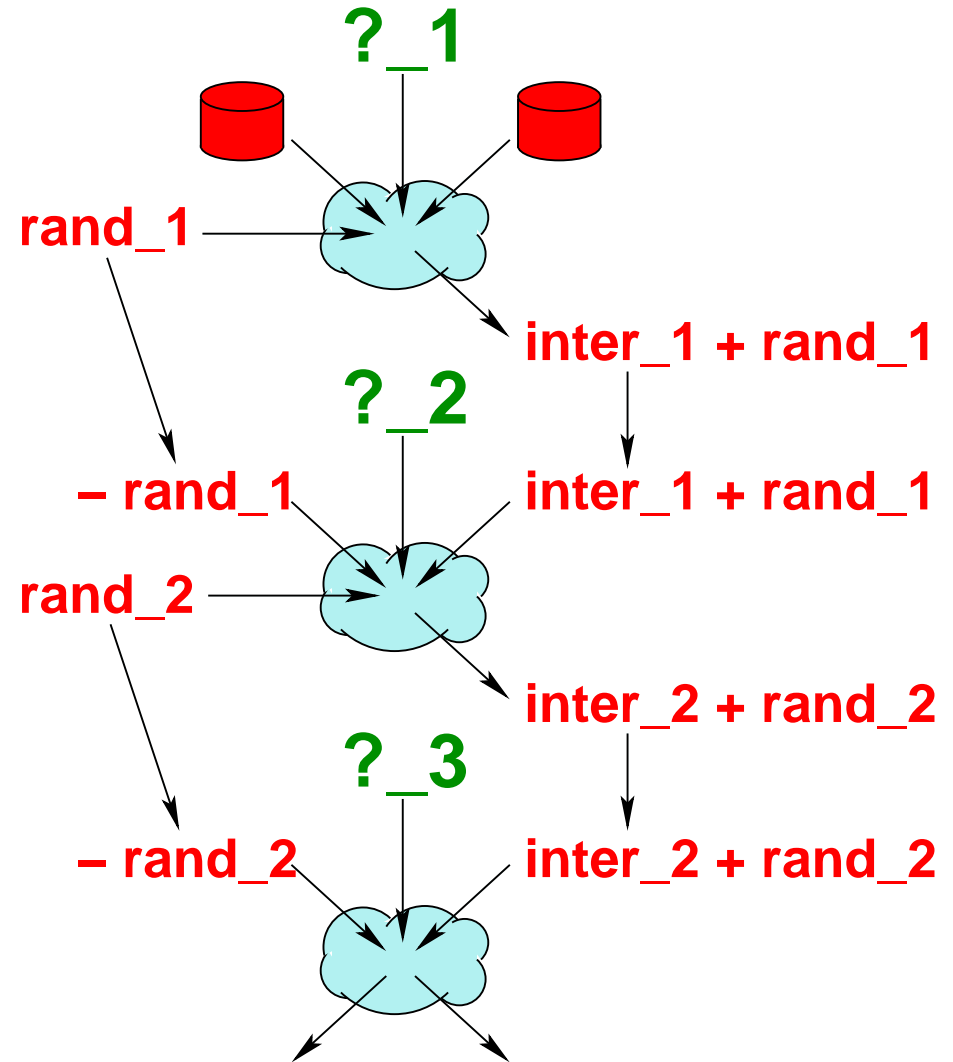
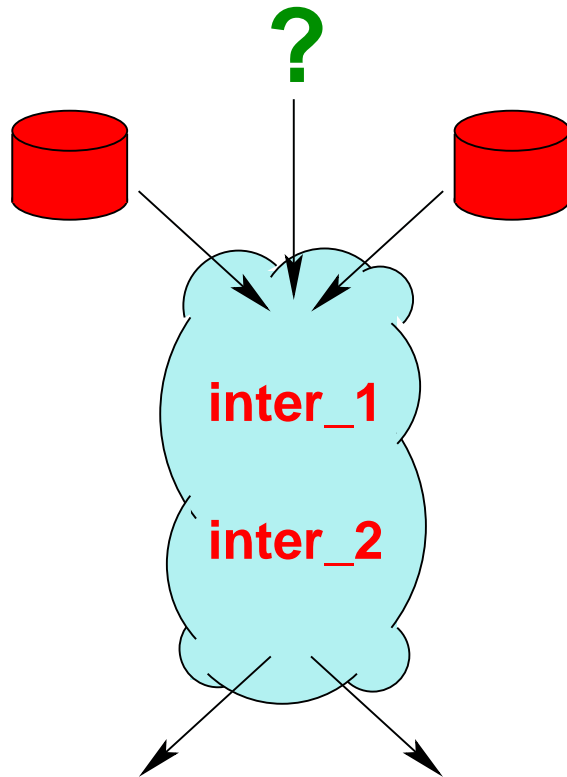


modular, hybrid



Shares to shares: the key to modularity with security

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- A circuit-generation library suitable for use with Fairplay.
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Using homomorphic encryption:

- Private bit vectors to private shares of their **scalar product**.
- Private shares of arguments to private shares of their **product**.

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Using the Yao generic two-party SMC scheme:

- Sequences of private shares of a sequence of values to their (public) **minindex**, the (smallest) index of the minimum.

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- Private bit vectors to private shares of their **scalar product**.
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Using the Yao generic two-party SMC scheme:

- Sequences of private shares of a sequence of values to their (public) **minindex**, the (smallest) index of the minimum.

... And using both the Yao generic scheme and homomorphic encryption:

- Private shares of an argument to private shares of its **logarithm**, following the Lindell-Pinkas proposal—corrected, optimized, and implemented in the work presented here.

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- Multiplicatively decompose x as $2^n(1 + \varepsilon)$, where $-1/4 \leq \varepsilon < 1/2$. Additively decompose the logarithm,

$$\ln x = \ln 2^n(1 + \varepsilon) = n \ln 2 + \ln(1 + \varepsilon) \quad (1)$$

The Taylor expansion of the latter term,

$$\ln(1 + \varepsilon) = \sum_{i=1}^{\infty} \frac{(-1)^{i-1} \varepsilon^i}{i} = \varepsilon - \frac{\varepsilon^2}{2} + \frac{\varepsilon^3}{3} - \frac{\varepsilon^4}{4} + \dots \quad (2)$$

will allow **configurable accuracy**.

- Protocol phase 1: From shares of x , compute shares of n and ε using **generic Yao** two-party secure computation.
- Protocol phase 2: From the shares of ε yielded by phase 1, compute shares of $\ln(1 + \varepsilon)$ —to “enough” terms of its expansion—using **oblivious polynomial evaluation**.

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- **Must** be decided in advance!
- Let N be the lowest agreed upper bound on n . ε may have as many as N bits of precision, which we want to preserve.
- We want similar precision in the output.
- Therefore, since we will be computing in integers, the polynomial we compute in phase 2 must be adjusted to accept ε scaled up by 2^N ; and to deliver $\ln(1 + \varepsilon)$ scaled up by some factor σ that should be at least 2^N .
- ... But **scaling of inputs/outputs** of SMC modules if they are to be accepted/delivered as **private shares** is not as trivial as we are accustomed to thinking.

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- Where α_1 and α_2 are the parties' respective additive shares, in some finite field (or ring) \mathcal{F} , of $\varepsilon \cdot 2^N$ to be delivered by phase 1,

$$\varepsilon = (\alpha_1 +_{\mathcal{F}} \alpha_2) / 2^N$$

- Scaling the phase 2 output up by factor σ , the Taylor series of (2) becomes

$$\sigma \ln(1 + \varepsilon) = \sum_{i=1}^{\infty} \frac{\sigma (-1)^{i-1} (\alpha_1 +_{\mathcal{F}} \alpha_2)^i}{i 2^{Ni}}$$

- ... But we will need a finite polynomial over \mathcal{F} for the oblivious polynomial evaluation.

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- Truncate the series at k terms for the desired accuracy.
- **If** the numerator will always be divisible by the denominator (in \mathbb{Z}); and ...
- **if** we use an \mathcal{F} large enough so that, where $m = |\mathcal{F}|$, all values in the recursive evaluation are always integers in the interval $[-\lfloor \frac{m}{2} \rfloor, \lfloor \frac{m}{2} \rfloor]$; ...
- **then** we can reinterpret the additions and multiplications, and even the divisions, as the corresponding operations in \mathcal{F} , ...
- allowing us to replace ' α_2 ' with variable ' y ', then open parentheses and collect terms to arrive at a polynomial over \mathcal{F} for oblivious polynomial evaluation.

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- **if** we use an \mathcal{F} large enough so that, where $m = |\mathcal{F}|$, all values in the recursive evaluation are always integers in the interval $[-\lfloor \frac{m}{2} \rfloor, \lfloor \frac{m}{2} \rfloor]$; ...
- **then** we can reinterpret the additions and multiplications, and even the divisions, as the corresponding operations in \mathcal{F} , ...
- allowing us to replace ' α_2 ' with variable ' y ', then open parentheses and collect terms to arrive at a polynomial over \mathcal{F} for oblivious polynomial evaluation.

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- Lindell and Pinkas set the scale-up factor σ at $2^N \text{lcm}(2, \dots, k)$, giving the truncated Taylor series

$$\ln(1 + \varepsilon) \cdot 2^N \text{lcm}(2, \dots, k) \approx$$

$$\sum_{i=1}^k \frac{(-1)^{i-1} (\text{lcm}(2, \dots, k)/i) (\alpha_1 +_{\mathcal{F}} \alpha_2)^i}{2^{N(i-1)}}$$

- In the numerator,

$$(\alpha_1 +_{\mathcal{F}} \alpha_2)^i = (\varepsilon \cdot 2^N)^i = \varepsilon^i \cdot 2^{Ni}$$

- Yet this is **not** generally divisible by $2^{N(i-1)}$.

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- Brute-force solution: We set σ at $2^{Nk} \text{lcm}(2, \dots, k)$, giving the truncated Taylor series

$$\ln(1 + \varepsilon) \cdot 2^{Nk} \text{lcm}(2, \dots, k) \approx \sum_{i=1}^k (-1)^{i-1} 2^{N(k-i)} (\text{lcm}(2, \dots, k)/i) (\alpha_1 +_{\mathcal{F}} \alpha_2)^i$$

- Surprisingly, this does not require that \mathcal{F} be significantly larger!
- But are other modules in the invoking modular protocol now saddled with the expense of the larger scaling factor?

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- Scaling **up** by an **integer** factor:
autonomously by the parties, no problem.
- Scaling **down** by an integer factor, or, more generally, scaling
by a **non-integer** factor:
requires an SMC episode.
- Autonomous scaling by a non-integer factor is not
possible—even to integer approximation! **Approximate
division does not distribute over modular addition.**
- A Yao SMC episode can accomplish arbitrary scaling, but
division and table look-ups are expensive.

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- Integer part of scale-up factor σ handled separately, leaving a **scale-down** to compute and add modularly.
- For p parties, only p variants of excess in the simple distribution of the scale-down over p original shares.
- A Yao circuit can
 - accept the parties' original shares;
 - accept the parties' simple-minded autonomous scale-downs;
 - accept a random value from parties 1 through $p - 1$;
 - determine from the non-modular sum of the original shares which correction to apply to the autonomous scale-downs, and share the corrected scale-down using the random values.

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- It is possible to trade off the perfection of the perfect secrecy in the sharing for the possibility of autonomous scaling after all—no additional SMC needed!
- Theoretically challenging.
- Eminently practical.

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- Theoretically challenging.
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- **Compatibility:**
We can efficiently **reverse unwanted scale-ups** that have entered as technical artifacts.
- **Performance:**
We can efficiently **achieve wanted scale-ups**, and so avoid the **table look-up** recommended by Lindell and Pinkas to convert n to $2^N \cdot n \ln 2$ **within the Yao computation** of phase 1.

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- Yao-circuit generator in Perl.

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- Yao-circuit generator in Perl.
- Fairplay Yao-circuit runner in Java.

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- Yao-circuit generator in Perl.
- Fairplay Yao-circuit runner in Java.
- Controlling program, invoking Fairplay for phase 1 and implementing the oblivious polynomial evaluation of phase 2, in C.

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- Yao-circuit generator in Perl.
- Fairplay Yao-circuit runner in Java.
- Controlling program, invoking Fairplay for phase 1 and implementing the oblivious polynomial evaluation of phase 2, in C.
- Bignums and basic cryptographic math from libssl and libcrypto.

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- Both parties running as processes on this laptop.

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- Both parties running as processes on this laptop.
- Intel Pentium M at 1.86 GHz.

N	k	modulus bits	gates	absolute error	time (seconds)
13	4	60	1386	< 0.00458	3.57
22	5	120	2797	< 0.00183	6.16
28	7	210	4732	< 0.00034	10.04

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- The Lindell-Pinkas two-party secure logarithm protocol, as it has evolved in the course of our implementation, seems to work well and be quite usable as a module in a complex two-party SMC data-mining protocol.
- SMC usability and performance enhancements will continue.
- ... But SMC can already do much now. The main impediment to real-world application is a **gap in awareness and understanding** of what can already be done with SMC today, a gap that is just beginning to be addressed.