

Iris: Higher-Order Concurrent Separation Logic

Lecture 22: Asynchronous reasoning about randomized programs

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Overview

Earlier:

- ▶ Operational Semantics of $\lambda_{\text{ref,conc}}$: $e, (h, e) \rightsquigarrow (h, e')$, and $(h, \mathcal{E}) \rightarrow (h', \mathcal{E}')$
- ▶ Basic Logic of Resources : $l \hookrightarrow v, P * Q, P \multimap Q, \Gamma \mid P \vdash Q$
- ▶ Basic Separation Logic : $\{P\} e \{v.Q\} : \text{Prop}, \text{isList } l \text{ xs}, \text{ADTs}, \text{foldr}$
- ▶ Later (\triangleright) and Persistent (\square) Modalities.
- ▶ Concurrency Intro, Invariants and Ghost State
- ▶ CAS, Spin Locks, Concurrent Counter Modules.
- ▶ Monotone Resource Algebra
- ▶ Case studies: Ticket Lock, Array Based Queuing Lock, and Stack with Helping
- ▶ More details of constructions, e.g., weakest preconditions, etc.
- ▶ Logical Relations for safety & type abstraction in Iris
- ▶ Randomization, $\mathbf{F}_{\mu, \text{ref}}^{\text{rand}}$ operational semantics, contextual & logical refinement

Today:

- ▶ Case study: Security of ElGamal public key encryption
- ▶ Lazy vs eager sampling
- ▶ Asynchronous coupling rules
- ▶ Ongoing & future work

The ElGamal public key scheme

$keygen \triangleq \lambda _ . \text{let } sk := \text{rand}(n) \text{ in}$
 $\text{let } pk := g^{sk} \text{ in}$
 (sk, pk)
 $dec \triangleq \lambda sk (B, X) . X \cdot B^{-sk}$

$enc \triangleq \lambda pk msg . \text{let } b := \text{rand}(n) \text{ in}$
 $\text{let } B := g^b \text{ in}$
 $\text{let } X := msg \cdot pk^b \text{ in}$
 (B, X)

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Parameterized by a group G encoding messages, ciphertexts, and keys.

Write $G = (1, \cdot, -^{-1})$ for a finite cyclic group of order $|G|$, generated by g , and let $n = |G| - 1$.

Public key security, I

$keygen \triangleq \lambda \dots$

let $sk := rand(n)$ in

let $pk := g^{sk}$ in

(sk, pk)

$enc \triangleq \lambda pk \ msg.$

let $b := rand(n)$ in

let $B := g^b$ in

let $X := msg \cdot pk^b$ in

(B, X)

$PK_{real} \triangleq$

let $(sk, pk) := keygen()$ in

let $count := ref\ 0$ in

let $query = \lambda \ msg.$

if ! $count \neq 0$ then

None

else

$count \leftarrow 1;$

let $(B, X) = enc\ pk\ msg$ in

Some (B, X)

in $(pk, query)$

$PK_{rand} \triangleq$

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let $count := ref\ 0$ in

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if ! $count \neq 0$ then

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else

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let $x := rand(n)$ in

let $(B, X) := (g^b, g^x)$ in

Some (B, X)

in $(pk, query)$

The Decisional Diffie-Hellman assumption

Assumption: DH_{real} and DH_{rand} are hard to distinguish.

$$DH_{real} \triangleq \text{let } a := \text{rand}(n) \text{ in} \\ \text{let } b := \text{rand}(n) \text{ in} \\ (g^a, g^b, g^{ab})$$

$$DH_{rand} \triangleq \text{let } a := \text{rand}(n) \text{ in} \\ \text{let } b := \text{rand}(n) \text{ in} \\ \text{let } c := \text{rand}(n) \text{ in} \\ (g^a, g^b, g^c)$$

Proof idea: exhibit \mathcal{C} s.t. we can prove

$$\vdash PK_{real} \simeq_{\text{ctx}} \mathcal{C}[DH_{real}] : \tau_{PK} \quad (1)$$

$$\vdash PK_{rand} \simeq_{\text{ctx}} \mathcal{C}[DH_{rand}] : \tau_{PK} \quad (2)$$

Then PK_{real} and PK_{rand} should also be hard to distinguish by our assumption.

Public key security, II

$PK_{real} \triangleq$

let $(sk, pk) := \text{keygen}()$ in

let $count := \text{ref } 0$ in

let $query = \lambda \text{msg}.$

if ! $count \neq 0$ then

None

else

$count \leftarrow 1;$

let $(B, X) = \text{enc } pk \text{ msg}$ in

Some (B, X)

in $(pk, query)$

$PK_{rand} \triangleq$

let $(sk, pk) := \text{keygen}()$ in

let $count := \text{ref } 0$ in

let $query = \lambda \text{msg}.$

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else

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let $b := \text{rand}(n)$ in

let $x := \text{rand}(n)$ in

let $(B, X) := (g^b, g^x)$ in

Some (B, X)

in $(pk, query)$

(a) The security games.

Public key security, II

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$PK_{rand} \triangleq$

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if ! $count \neq 0$ then

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let $b := \text{rand}(n)$ in

let $x := \text{rand}(n)$ in

let $(B, X) := (g^b, g^x)$ in

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(a) The security games.

$\mathcal{C}[-] \triangleq$

let $(pk, B, C) := -$ in

let $count := \text{ref } 0$ in

let $query = \lambda \text{msg}.$

if ! $count \neq 0$ then

None

else

$count \leftarrow 1;$

let $X = \text{msg} \cdot C$ in

Some (B, X)

in $(pk, query)$

(b) The DH reduction context.

ElGamal security reduction, I

PK_{real}	\simeq_{ctx}	$C[DH_{real}]$
let $sk := \text{rand}(n)$ in		let $(pk, B, C) =$
let $pk := g^{sk}$ in		let $a := \text{rand}(n)$ in
		let $b := \text{rand}(n)$ in
		(g^a, g^b, g^{ab}) in
let $count := \text{ref } 0$ in		let $count := \text{ref } 0$ in
let $query = \lambda msg.$		let $query = \lambda msg.$
if ! $count \neq 0$ then		if ! $count \neq 0$ then
None		None
else		else
$count \leftarrow 1;$		$count \leftarrow 1;$
let $b = \text{rand}(n)$ in		
let $B = g^b$ in		
		let $X := msg \cdot C$ in
let $X = msg \cdot pk^b$ in		Some (B, X)
Some (B, X)		
in $(pk, query)$		in $(pk, query)$

Isolating the problem: lazy/eager sampling

eager \triangleq `let $b := \text{flip}()$ in $\lambda_.$ b`

lazy \triangleq `let $r := \text{ref}(\text{None})$ in`

`$\lambda_.$ match ! r with`

`Some(b) \Rightarrow b`

`| None \Rightarrow let $b := \text{flip}()$ in`

`$r \leftarrow \text{Some}(b)$;`

`b`

`end`

Isolating the problem: lazy/eager sampling

$eager \triangleq \text{let } b := \text{flip}() \text{ in } \lambda_ . b$

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$r \leftarrow \text{Some}(b);$

b

end

We expect

$\vdash lazy \simeq_{\text{ctx}} eager : \text{unit} \rightarrow \text{bool}$

Recall: we plug *lazy*, *eager* into a well-typed context evaluating to a boolean.

Not the same distribution on values, but same observations!

Isolating the problem: lazy/eager sampling

$eager \triangleq \text{let } b := \text{flip}() \text{ in } \lambda_ . b$

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REL-COUPLE-RANDS

f bijection

$\forall n \leq N. \Delta \models_{\mathcal{E}} E[n] \lesssim E'[f(n)] : \tau$

$\Delta \models_{\mathcal{E}} E[\text{rand}(N)] \lesssim E'[\text{rand}(N)] : \tau$

Isolating the problem: lazy/eager sampling

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$\Delta \models_{\mathcal{E}} E[\text{rand}(N)] \lesssim E'[\text{rand}(N)] : \tau$

Does not apply.

Isolating the problem: lazy/eager sampling

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REL-COUPLE-RANDS

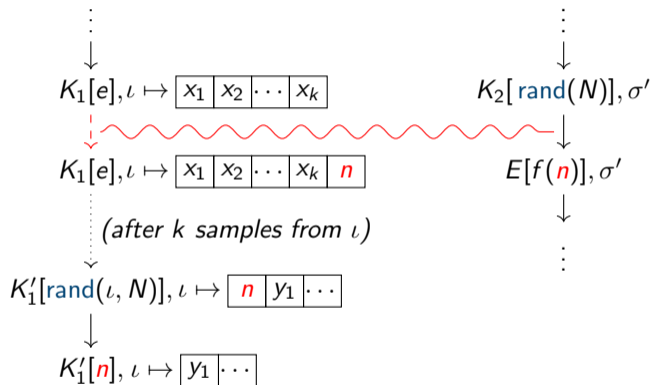
f bijection

$\forall n \leq N. \Delta \models_{\mathcal{E}} E[n] \lesssim E'[f(n)] : \tau$

$\Delta \models_{\mathcal{E}} E[\text{rand}(N)] \lesssim E'[\text{rand}(N)] : \tau$

Does not apply. 🐱

High-level idea: labelled sampling and presampling tapes



An asynchronous coupling established through the rule REL-COUPLE-TAPE-L.

Syntax

Modify $\mathbf{F}_{\mu, \text{ref}}^{\text{rand}}$ as follows

$$\begin{array}{ll} & \vdots \\ \text{Val} & v ::= \dots \mid \iota \in \text{Label} \\ \text{Exp} & e ::= \dots \mid \text{rand}(e_1, e_2) \mid \text{tape } e \\ \text{ECtx} & E ::= \dots \mid \text{rand}(e, K) \mid \text{rand}(K, v) \mid \text{tape}(K) \\ \\ \text{Heap} & h \in \text{Loc} \xrightarrow{\text{fin}} \text{Val} \\ \text{TapeMap} & = \text{Label} \xrightarrow{\text{fin}} \text{Tape} \\ \text{State} & \sigma \in \text{Heap} \times \text{TapeMap} \\ \text{Tape} & t \in \{(N, \vec{n}) \mid N \in \mathbb{N} \wedge \vec{n} \in \mathbb{N}_{\leq N}^*\} \\ \text{Config} & \rho ::= (\sigma, e) \\ \\ \text{Type} & \tau ::= \dots \mid \text{tape} \end{array}$$

Operational semantics

$$\begin{array}{llll} \sigma, \text{tape}(N) & \rightarrow^1 & \sigma[\iota \mapsto (N, \varepsilon)], \iota & \text{if } \iota = \text{fresh}(\sigma) \\ \sigma, \text{rand}(N, \iota) & \rightarrow^{1/(N+1)} & \sigma, n & \text{if } \sigma(\iota) = (N, \varepsilon) \text{ and } n \leq N \\ \sigma, \text{rand}(N, \iota) & \rightarrow^1 & \sigma[\iota \mapsto (N, \vec{n})], n & \text{if } \sigma(\iota) = (N, n \cdot \vec{n}) \end{array}$$

Operational semantics

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No primitives in the language add values to the tapes!

Presampling steps are *ghost operations* appearing only in the relational logic.

A resource algebra for tapes

Recall

$$Tape = \{(N, \vec{n}) \mid N \in \mathbb{N} \wedge \vec{n} \in \mathbb{N}_{\leq N}^*\}$$

and

$$TapeMap = Label \xrightarrow{\text{fin}} Tape$$

We can define a RA like for heaps.

A resource algebra for tapes

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$$\iota \hookrightarrow (N, \vec{n})$$

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We can define a RA like for heaps. Tape ownership:

$$\iota \hookrightarrow (N, \vec{n})$$

Likewise for the right-hand side “spec” program:

$$\iota \hookrightarrow_s (N, \vec{n})$$

Reasoning with tapes: one-sided rules

$$\frac{\text{REL-ALLOC-TAPE-L} \quad \forall \iota. \iota \hookrightarrow (N, \varepsilon) \multimap \Delta \Vdash E[\iota] \lesssim e : \tau}{\Delta \Vdash E[\text{tape}(N)] \lesssim e : \tau}$$

$$\frac{\text{REL-ALLOC-TAPE-R} \quad \forall \iota. \iota \hookrightarrow_s (N, \varepsilon) \multimap \Delta \Vdash e \lesssim E[\iota] : \tau}{\Delta \Vdash e \lesssim E[\text{tape}(N)] : \tau}$$

$$\frac{\text{REL-RAND-TAPE-L} \quad \iota \hookrightarrow (N, n \cdot \vec{n}) \quad \iota \hookrightarrow (N, \vec{n}) \multimap \Delta \Vdash_{\mathcal{E}} E[n] \lesssim e_2 : \tau}{\Delta \Vdash_{\mathcal{E}} E[\text{rand}(N, \iota)] \lesssim e_2 : \tau}$$

$$\frac{\text{REL-RAND-TAPE-R} \quad \iota \hookrightarrow_s (N, n \cdot \vec{n}) \quad \iota \hookrightarrow_s (N, \vec{n}) \multimap \Delta \Vdash_{\mathcal{E}} e_1 \lesssim E[n] : \tau}{\Delta \Vdash_{\mathcal{E}} e_1 \lesssim E[\text{rand}(N, \iota)] : \tau}$$

$$\frac{\text{REL-RAND-TAPE-EMPTY-L} \quad \iota \hookrightarrow (N, \varepsilon) \quad \forall n \leq N. \iota \hookrightarrow (N, \varepsilon) \multimap \Delta \Vdash_{\mathcal{E}} E[n] \lesssim e_2 : \tau}{\Delta \Vdash_{\mathcal{E}} E[\text{rand}(N, \iota)] \lesssim e_2 : \tau}$$

$$\frac{\text{REL-RAND-TAPE-EMPTY-R} \quad \iota \hookrightarrow_s (N, \varepsilon) \quad \forall n \leq N. \iota \hookrightarrow_s (N, \varepsilon) \multimap \Delta \Vdash_{\mathcal{E}} e_1 \lesssim E[n] : \tau}{\Delta \Vdash_{\mathcal{E}} e_1 \lesssim E[\text{rand}(N, \iota)] : \tau}$$

Reasoning with tapes: asynchronous couplings

REL-COUPLE-TAPE-L

$$\frac{f \text{ bijection} \quad \iota \hookrightarrow (N, \vec{n}) \quad \forall n \leq N. \iota \hookrightarrow (N, \vec{n} \cdot n) \quad * \quad \Delta \Vdash_{\mathcal{E}} e_1 \lesssim E[f(n)] : \tau}{\Delta \Vdash_{\mathcal{E}} e_1 \lesssim E[\text{rand}(N)] : \tau}$$

REL-COUPLE-TAPE-R

$$\frac{f \text{ bijection} \quad \iota \hookrightarrow_s (N, \vec{n}) \quad \forall n \leq N. \iota \hookrightarrow_s (N, \vec{n} \cdot f(n)) \quad * \quad \Delta \Vdash_{\mathcal{E}} E[n] \lesssim e_2 : \tau}{\Delta \Vdash_{\mathcal{E}} E[\text{rand}(N)] \lesssim e_2 : \tau}$$

REL-COUPLE-TAPES

$$\frac{\begin{array}{c} \iota \hookrightarrow (N, \vec{n}) \quad \iota' \hookrightarrow_s (N, \vec{n}') \\ f \text{ bijection} \\ \forall n \leq N. \iota \hookrightarrow (N, \vec{n} \cdot n) \quad * \quad \iota' \hookrightarrow_s (N, \vec{n}' \cdot f(n)) \quad * \quad \Delta \Vdash_{\mathcal{E}} e_1 \lesssim e_2 : \tau \end{array}}{\Delta \Vdash_{\mathcal{E}} e_1 \lesssim e_2 : \tau}$$

REL-RAND-ERASE-R

$$\frac{\iota \hookrightarrow_s (N, \varepsilon) \quad \forall n \leq N. \Delta \Vdash_{\mathcal{E}} E[n] \lesssim E'[n] : \tau}{\Delta \Vdash_{\mathcal{E}} E[\text{rand}(N)] \lesssim E'[\text{rand}(N, \iota)] : \tau}$$

REL-RAND-ERASE-L

$$\frac{\iota \hookrightarrow (N, \varepsilon) \quad \forall n \leq N. \Delta \Vdash_{\mathcal{E}} E[n] \lesssim E'[n] : \tau}{\Delta \Vdash_{\mathcal{E}} E[\text{rand}(N, \iota)] \lesssim E'[\text{rand}(N)] : \tau}$$

Mechanization demo

ElGamal security reduction, II

 PK_{real} \simeq_{ctx} PK_{real}^{tape}

let $sk := \text{rand}(n)$ in

let $pk := g^{sk}$ in

let $count := \text{ref } 0$ in

let $query = \lambda msg.$

if ! $count \neq 0$ then

None

else

$count \leftarrow 1;$

let $b = \text{rand}(n)$ in

let $B = g^b$ in

let $X = msg \cdot pk^b$ in

Some (B, X)

in $(pk, query)$

let $\beta := \text{tape}(n)$ in

let $sk := \text{rand}(n)$ in

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ElGamal security reduction, II

$PK_{real}^{tape} \simeq_{ctx}$

```
let  $\beta := \text{tape}(n)$  in
let  $sk := \text{rand}(n)$  in
let  $pk := g^{sk}$  in

let  $count := \text{ref } 0$  in
let  $query = \lambda \text{ msg.}$ 
  if !  $count \neq 0$  then
    None
  else
     $count \leftarrow 1;$ 
    let  $b = \text{rand}(n, \beta)$  in
    let  $B = g^b$  in
    let  $C = pk^b$  in
    let  $X = \text{msg} \cdot C$  in
    Some  $(B, X)$ 
in  $(pk, query)$ 
```

$C[DH_{real}]$

```
let  $(pk, B, C) =$ 
  let  $a := \text{rand}(n)$  in
  let  $b := \text{rand}(n)$  in
   $(g^a, g^b, g^{ab})$  in
let  $count := \text{ref } 0$  in
let  $query = \lambda \text{ msg.}$ 
  if !  $count \neq 0$  then
    None
  else
     $count \leftarrow 1;$ 
    let  $X := \text{msg} \cdot C$  in
    Some  $(B, X)$ 
in  $(pk, query)$ 
```

Current work: reasoning about approximate correctness

- ▶ program logic:

$$\boxed{up_to\ \varepsilon}^\gamma \vdash \{P\} e \{Q\}$$

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$$\forall \sigma, P \Rightarrow \sum_{\{v \in \text{Val} \mid \neg Q(v)\}} \text{exec}(\sigma, e)(v) < \varepsilon$$

Current work: reasoning about approximate correctness

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$$\boxed{\text{up_to } \varepsilon}^\gamma \vdash \{P\} e \{Q\}$$

- ▶ adequacy:

$$\forall \sigma, P \Rightarrow \sum_{\{v \in \text{Val} \mid \neg Q(v)\}} \text{exec}(\sigma, e)(v) < \varepsilon$$

- ▶ examples:

- ▶ cryptographic keys are hard to guess
- ▶ hash collisions are unlikely
- ▶ rejection samplers with arbitrary precision

Current work: reasoning about approximate refinement

- ▶ program logic:

$$\boxed{up_to\ \varepsilon}^\gamma \vdash \{P\} e_1 < e_2 \{Q\}$$

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- ▶ program logic:

$$\boxed{\text{up_to } \varepsilon}^\gamma \vdash \{P\} e_1 < e_2 \{Q\}$$

- ▶ adequacy:

If P holds, then for all σ_1, σ_2 , there exists an ε -approximate left-partial Q -coupling between $\text{exec}(\sigma_1, e_1)$ and $\text{exec}(\sigma_2, e_2)$.

Current work: reasoning about approximate refinement

- ▶ program logic:

$$\boxed{\text{up_to } \varepsilon}^\gamma \vdash \{P\} e_1 < e_2 \{Q\}$$

- ▶ adequacy:

If P holds, then for all σ_1, σ_2 , there exists an ε -approximate left-partial Q -coupling between $\text{exec}(\sigma_1, e_1)$ and $\text{exec}(\sigma_2, e_2)$.

- ▶ Examples

- ▶ from crypto: PRP/PRF switching lemma
- ▶ rejection samplers for non-uniform distributions?
- ▶ differential privacy?

Current work: reasoning about termination-preserving refinement

- ▶ program logic:

$$\vdash_{\mathcal{M}} \{\text{True}\} e \{\lambda_. \text{True}\}$$

Current work: reasoning about termination-preserving refinement

- ▶ program logic:

$$\vdash_{\mathcal{M}} \{\text{True}\} e \{\lambda_. \text{True}\}$$

- ▶ adequacy:

$$\forall \sigma, \quad \sum_{a \in A} \text{exec}(\mathcal{M})(a) \leq \sum_{v \in \text{Val}} \text{exec}(\sigma, e)(v)$$

Current work: reasoning about termination-preserving refinement

- ▶ program logic:

$$\vdash_{\mathcal{M}} \{\text{True}\} e \{\lambda_. \text{True}\}$$

- ▶ adequacy:

$$\forall \sigma, \quad \sum_{a \in A} \text{exec}(\mathcal{M})(a) \leq \sum_{v \in \text{Val}} \text{exec}(\sigma, e)(v)$$

- ▶ examples

- ▶ lazily sampled, infinite precision real numbers
- ▶ treap data structures
- ▶ iterated Markov chains
- ▶ task schedulers?
- ▶ implementations of stochastic processes?

Future work

- ▶ Reasoning about expected running time
 - ▶ program logic?

$$\boxed{\text{fuel } c}^\gamma \vdash \{P\} e \{Q\}$$

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 - ▶ program logic?

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If P holds, then for all σ , the expected runtime of (σ, e) is c .

Future work

- ▶ Reasoning about expected running time
 - ▶ program logic?

$$\boxed{\text{fuel } c}^\gamma \vdash \{P\} e \{Q\}$$

- ▶ adequacy?

If P holds, then for all σ , the expected runtime of (σ, e) is c .

- ▶ Examples

- ▶ algorithms: quicksort?
- ▶ data structures: treaps? skip lists?
- ▶ rejection samplers?

Future work

- ▶ Reasoning about expected running time

- ▶ program logic?

$$\boxed{\text{fuel } c}^\gamma \vdash \{P\} e \{Q\}$$

- ▶ adequacy?

If P holds, then for all σ , the expected runtime of (σ, e) is c .

- ▶ Examples

- ▶ algorithms: quicksort?
 - ▶ data structures: treaps? skip lists?
 - ▶ rejection samplers?

- ▶ Reasoning about distributed randomized system

- ▶ dining philosophers, consensus, multi-party computation?

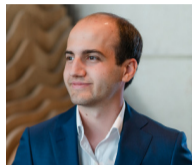
Joint work with



Alejandro Aguirre



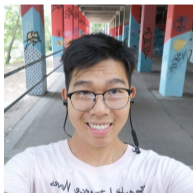
Simon Gregersen



Joseph Tassarotti



Lars Birkedal



Hei Li



Markus de Medeiros