

# Data-oblivious Computation

A common paradigm for private and secure computation

*David Darais (Galois, Inc.)*

# TWO WORLDS

**Traditional Computation**

**???**

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Bubble sort is the worst

Bubble sort is the best

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## Traditional Computation

Bubble sort is the worst

Insertion sort is mediocre

Merge sort is the best

???

Bubble sort is the best

Insertion sort is (also) the best

Merge sort is the worst

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RAM/array access is  $O(1)$

RAM/array access is  $O(\log(N))$

Data structures + recursion = easy

Data structures + recursion = hard

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Fully  
Homomorphic  
Encryption

Secure  
Multiparty  
Computation

Constant  
Time  
Execution



Information  
Flow  
Control

Differential  
Privacy

Protects secrets *during computation*

Protects secrets *after release*



Fully  
Homomorphic  
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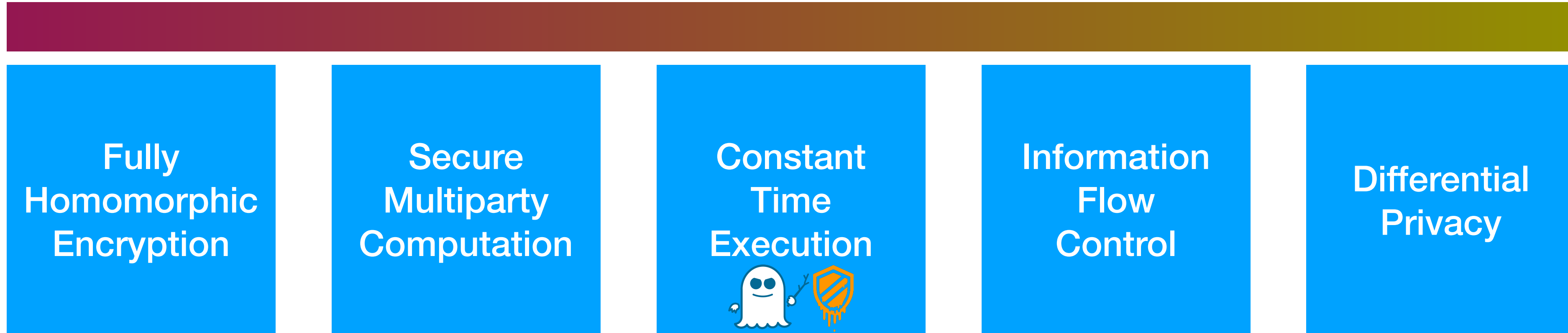
Information  
Flow  
Control

Differential  
Privacy



Protects secrets *during computation*

Protects secrets *after release*



**Performance** is critical

**Correctness** is critical

Protects secrets *during computation*

Protects secrets *after release*



Fully Homomorphic Encryption

Secure Multiparty Computation

Constant Time Execution  


Information Flow Control

Differential Privacy



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Data-oblivious Computation

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# TWO WORLDS

## **PROBLEM**

**No programming language or  
compiler understands  
data-oblivious computation**

# CONTROL FLOW

## Traditional Computation

```
if (raining) {  
    ice_in_coffee = false;  
    flavor = "hazelnut";  
    drink = new_coffee(ice_in_coffee,  
                       flavor,  
                       null);  
} else {  
    ice_in_coffee = true;  
    additive = "cream";  
    drink = new_coffee(ice_in_coffee,  
                       null,  
                       additive);  
}
```

# CONTROL FLOW

## Traditional Computation

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if (raining) {  
  ice_in_coffee = false;  
  flavor = "hazelnut";  
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  ice_in_coffee = true;  
  additive = "cream";  
  drink = new_coffee(ice_in_coffee,  
                    null,  
                    additive);  
}
```

## Data-oblivious Computation

```
ice_in_coffee_A = false;  
flavor_A = "hazelnut";  
drink_A = new_coffee(ice_in_coffee_A,  
                    flavor_A,  
                    null);
```

```
ice_in_coffee_B = true;  
additive_B = "cream";  
drink_B = new_coffee(ice_in_coffee_B,  
                    null,  
                    additive_B);
```

```
drink = raining ? drink_A : drink_B;
```

# EARLY DAYS FOR DO

**Traditional Computation**

**Data-oblivious Computation**

# EARLY DAYS FOR DO

## **Traditional Computation**

Decades of hardware/ISA research

Decades of compiler/IR research

Formal methods and analysis tools

100% bug-free tools (CompCert)

High performance applications

## **Data-oblivious Computation**



# EARLY DAYS FOR DO

## Traditional Computation

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## Data-oblivious Computation

<1 decade of hardware/ISA research

<1 decade of compiler/IR research

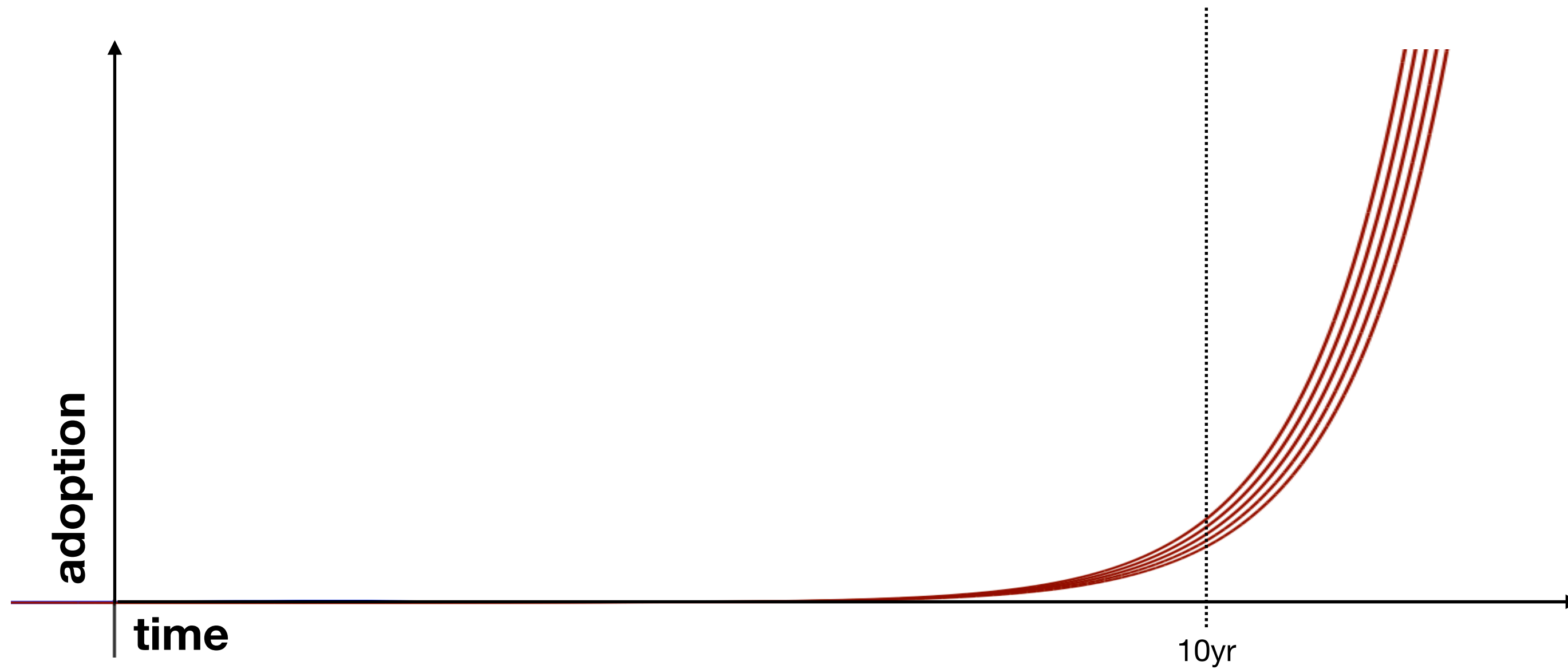
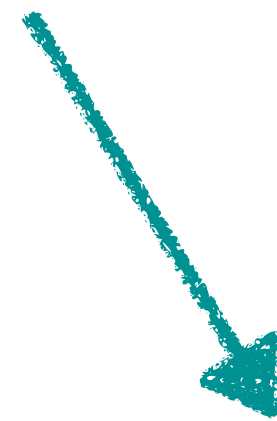
~0 formal methods and analysis tools

~0 bug-free tools

Low performance applications

# A CALL TO ARMS

security and privacy  
enhancing technologies



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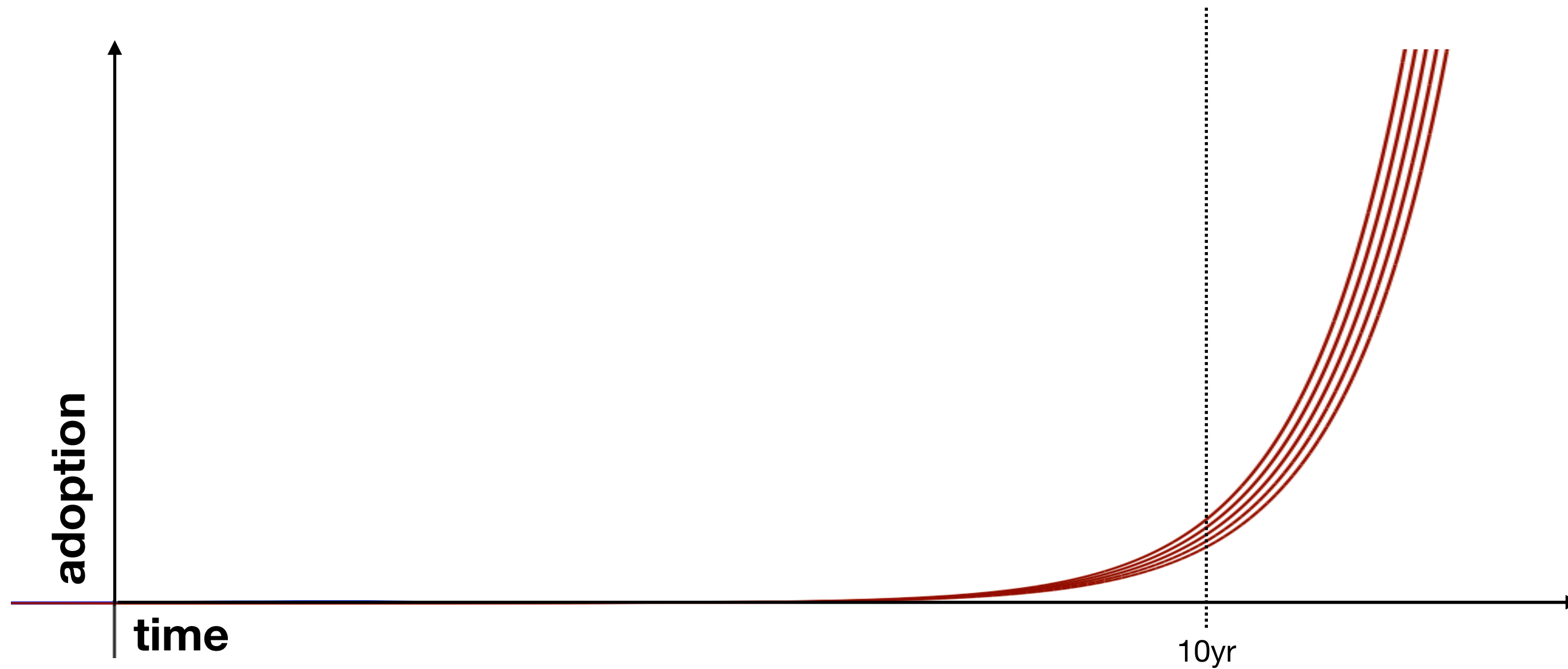
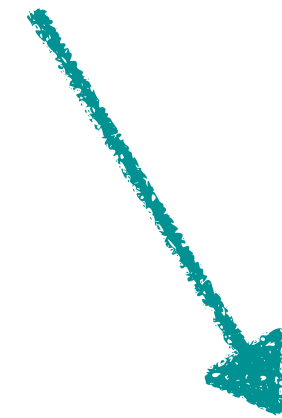
## WHERE WE ARE

security and privacy  
enhancing technologies

Oblivious Data Structures (ORAM)

DO ISAs (TinyRam)

DO Formal Methods (PMTO)



# A CALL TO ARMS

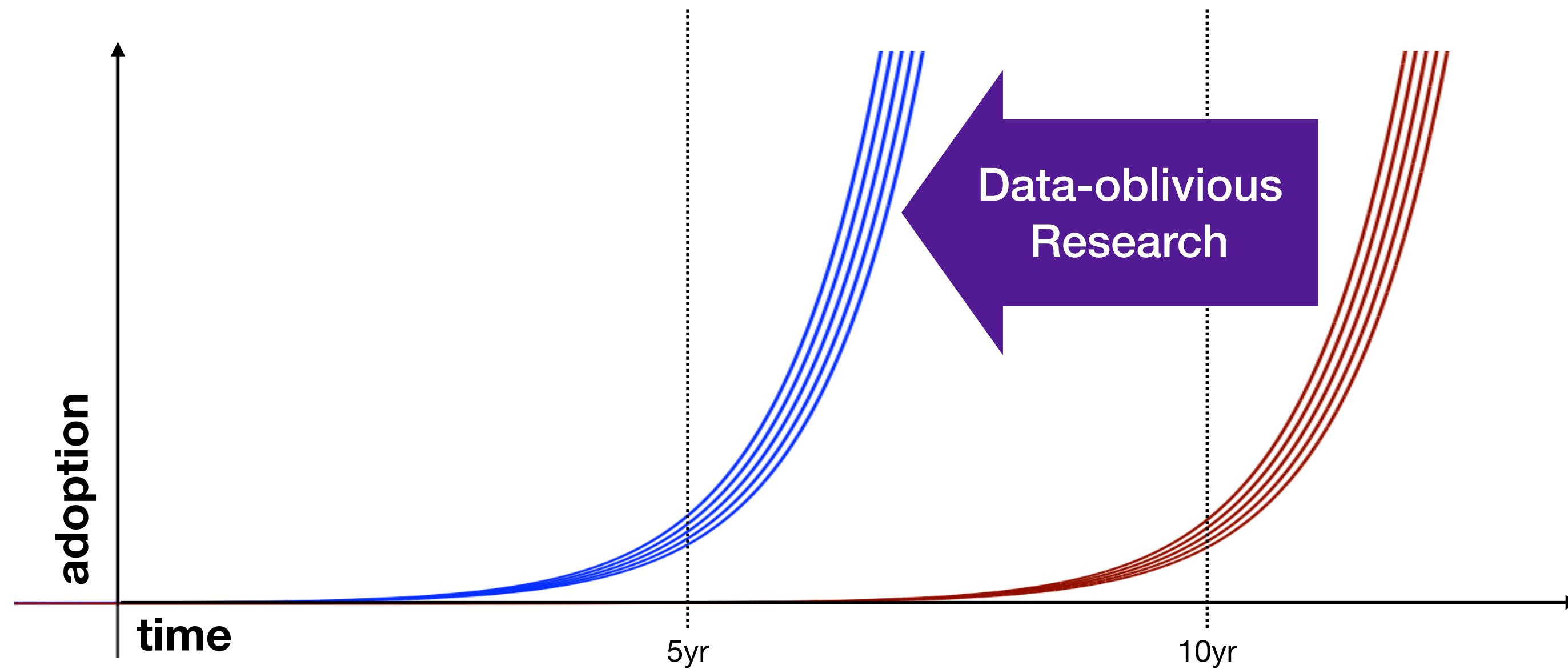
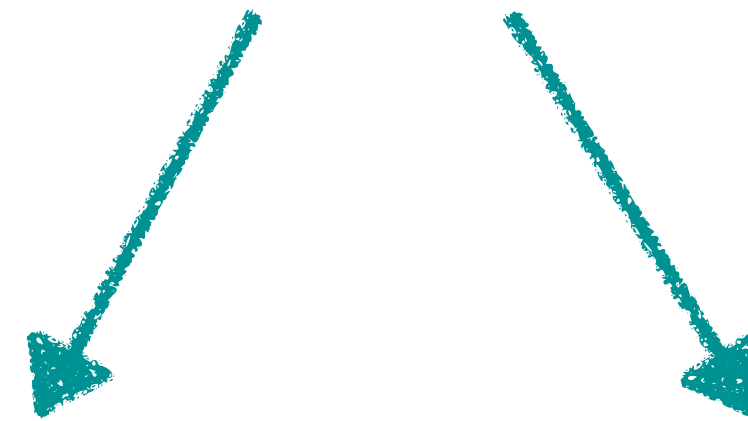
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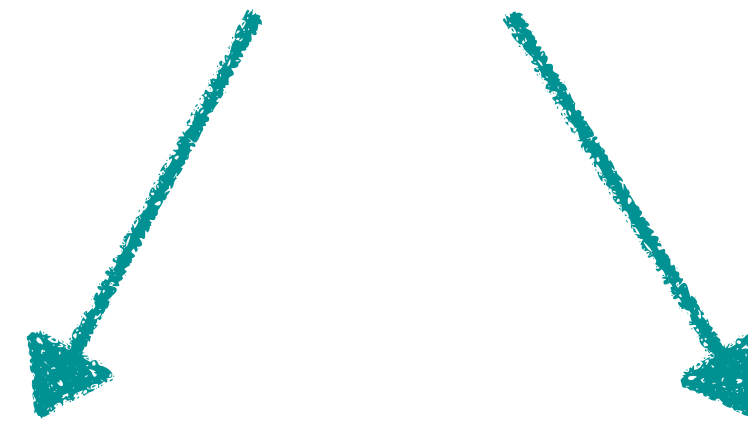
DO Formal Methods (PMTO)

security and privacy  
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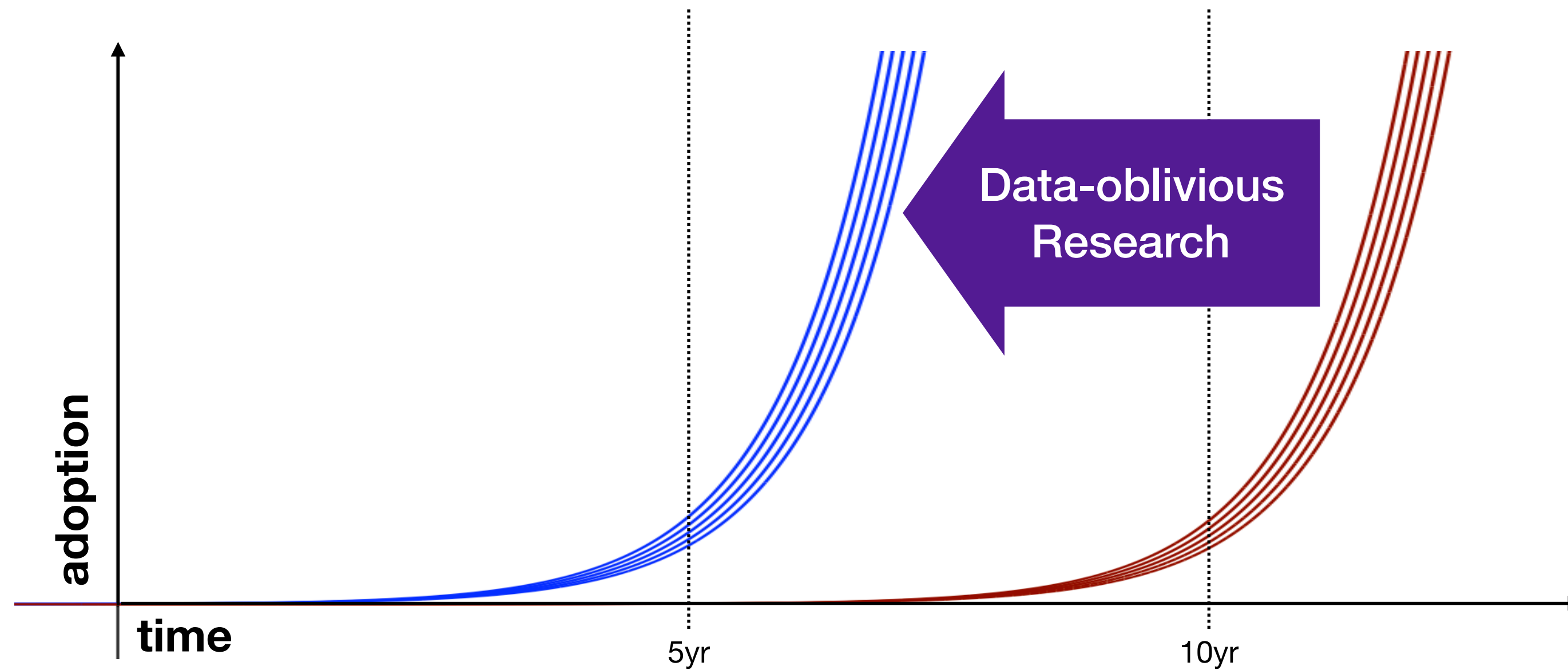


# A CALL TO ARMS

security and privacy  
enhancing technologies



Data-oblivious  
Research



## WHERE WE ARE

Oblivious Data Structures (ORAM)

DO ISAs (TinyRam)

DO Formal Methods (PMTO)

## WHAT WE NEED

Prog. languages for DO (**usability**)

Compilers for DO (**performance**)

Static analyses for DO (**accuracy**)

Data structures + libs for DO (**flexibility**)

Formal methods for DO (**assurance**)

Domain independence (**ubiquity**)

**END**

# RAM ACCESS

## Traditional Computation

```
if (raining) {  
    shopping[next_id] = "umbrella";  
} else {  
    shopping[next_id] = "sunglasses";  
}  
next_id++;
```

# RAM ACCESS

## Traditional Computation

```
if (raining) {  
    shopping[next_id] = "umbrella";  
} else {  
    shopping[next_id] = "sunglasses";  
}  
next_id++;
```

## Data-oblivious Computation

```
tmp = shopping[next_id];  
shopping[next_id] = raining ? "umbrella"  
                          : tmp;  
tmp = shopping[next_id];  
shopping[next_id] = !raining ? "sunglasses"  
                     : tmp;  
next_id++;
```