



arm

FOSDEM 2021 Hardware-aided Trusted Computing Devroom

*Veracruz*

Privacy-preserving collaboration

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# Background

We believe that **strong isolation technology** and **remote attestation**:

- Allow the design of novel data-intensive applications with fine-grained access control,
- Allow computations to be safely moved around, without sacrificing privacy or integrity,
- Potentially separate *possession* of data from *control* over that data

Here, **strong isolation** is our term for a range of hardware- and firmware-based isolation mechanisms, aiming to provide strong privacy and integrity guarantees

*Veracruz* is our vehicle for understanding what these technologies are capable of

# The Veracruz framework

A framework for defining flexible and efficient multi-party computations

Veracruz aims to support common use-cases for advanced cryptographic techniques

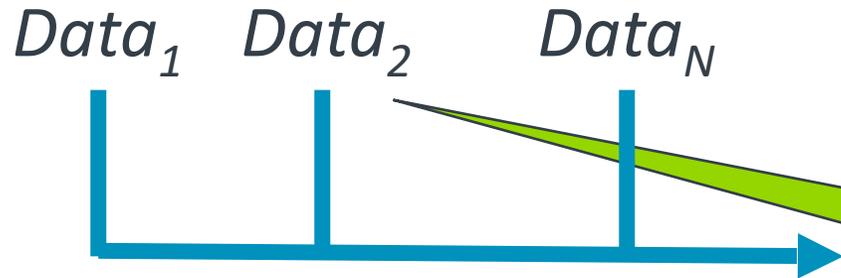
- Techniques like *homomorphic encryption*, *secure-multiparty computations*, and similar

Unlike those techniques, we aim to be:

1. **Efficient:** Be fast enough to execute "interesting" programs,
2. **Familiar:** Allow programmers to use familiar programming languages and tools,
3. **General:** Seamlessly support a large class of multi-party computations,
4. **Reusable:** Provide a single framework supporting a wide-range of privacy-preserving computations without requiring significant reconfiguration for each task

In common with those techniques, we aim to provide a strong **security/privacy guarantee**

# Veracruz from 50,000ft



The **data inputs** to Veracruz. Note that these can originate from different agents who are mutually distrusting.

# Veracruz from 50,000ft

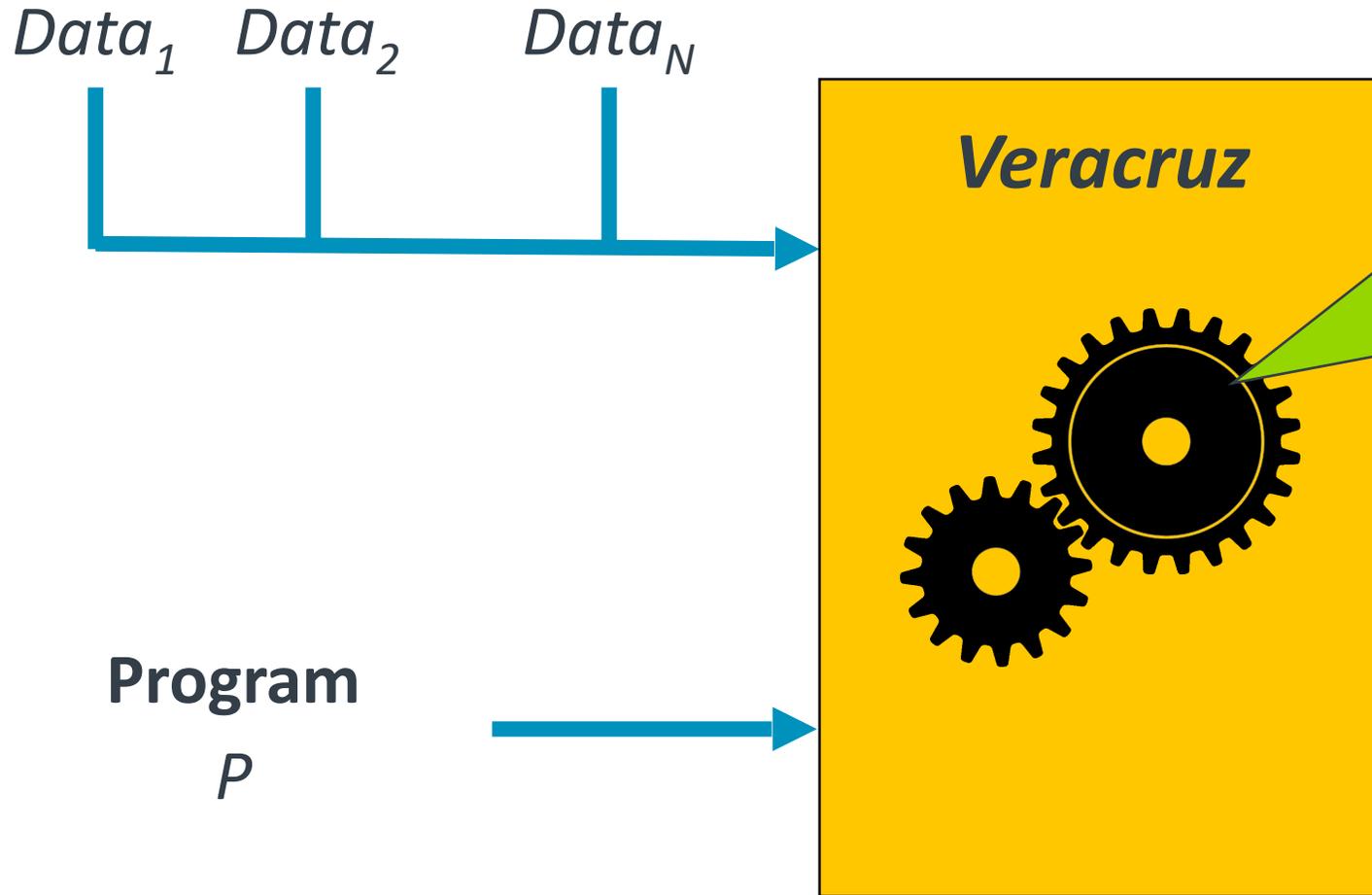


**Program**  
 $P$



The **program**, which may originate from an agent distinct from those providing the data inputs. In Veracruz, we use *WebAssembly (WASM)* as our executable.

# Veracruz from 50,000ft

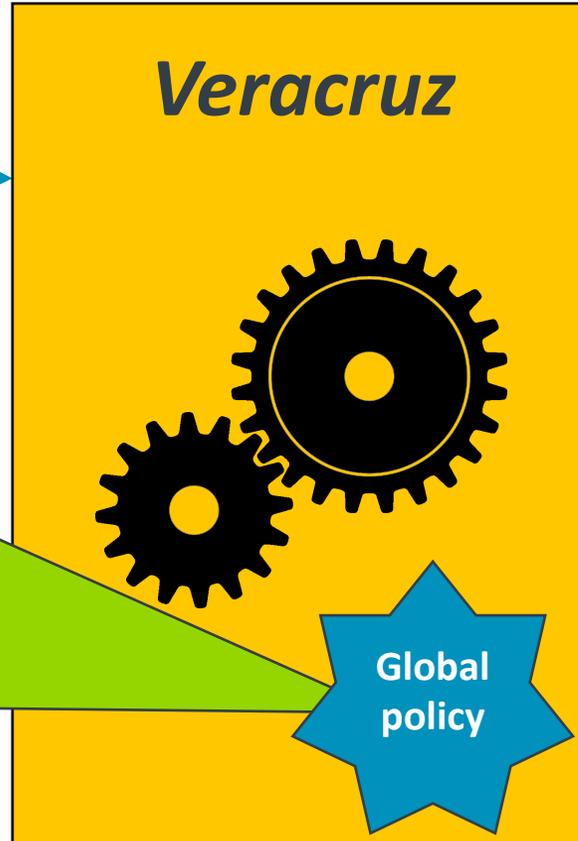


Program and data are provisioned securely into Veracruz, running on a **host**, which computes a result by applying the program to the data.

# Veracruz from 50,000ft

$Data_1$     $Data_2$     $Data_N$

A **policy** details the *roles* and *identities* of all involved in the computation and describes who can retrieve the result.



# Veracruz from 50,000ft

$Data_1$     $Data_2$     $Data_N$



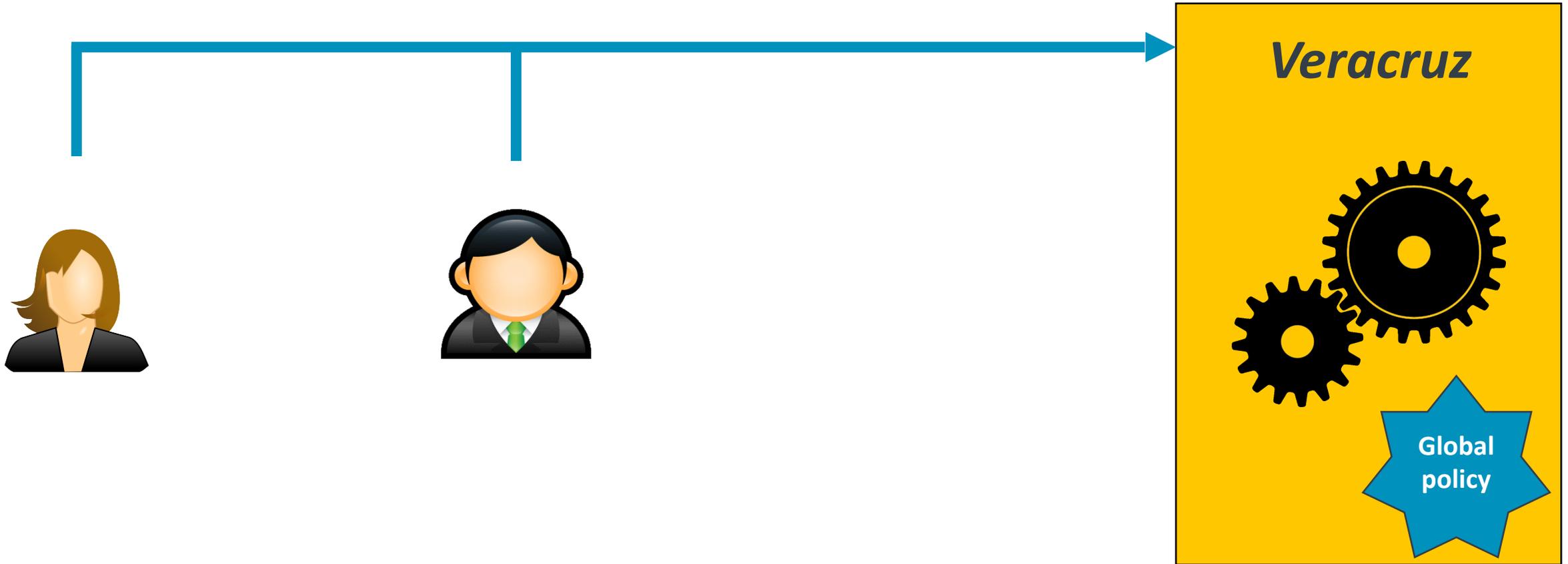
To maintain secrecy we need to control the *expressivity* of the program  $P$ , and the *capabilities* of its environment, which computes the result.

Program  
 $P$

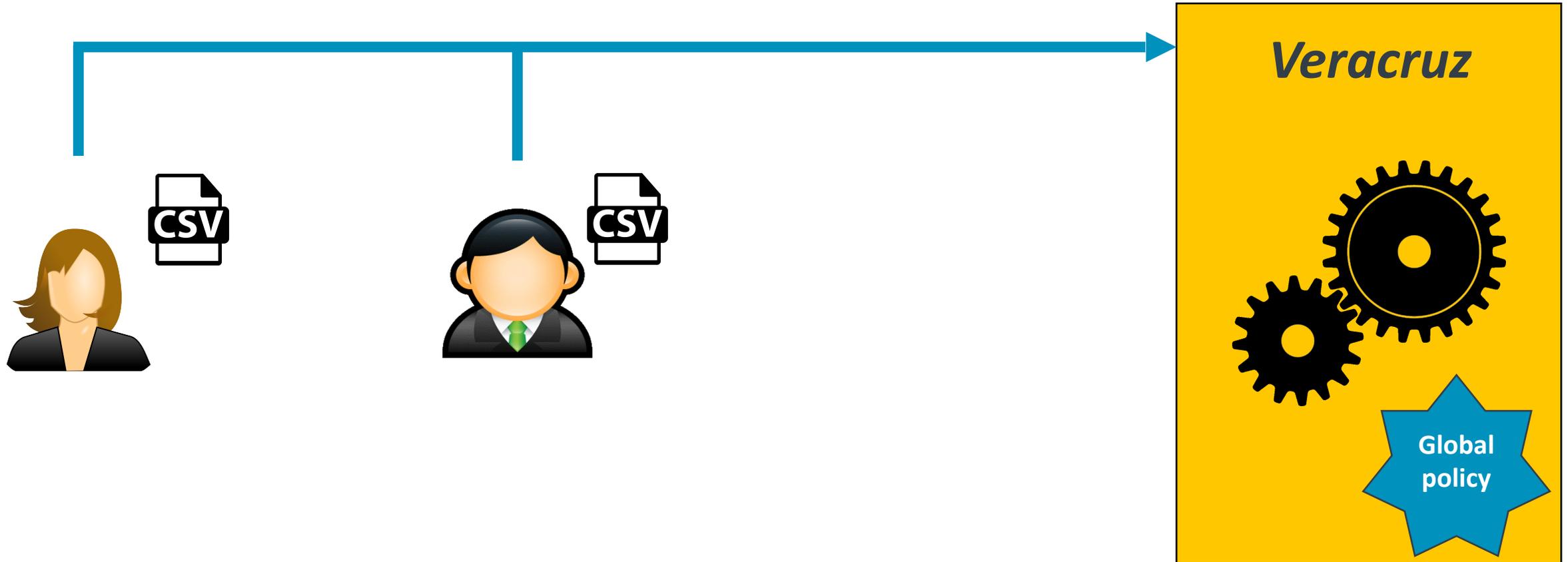


**Result**  
 $P(Data_1, Data_2, \dots, Data_N)$

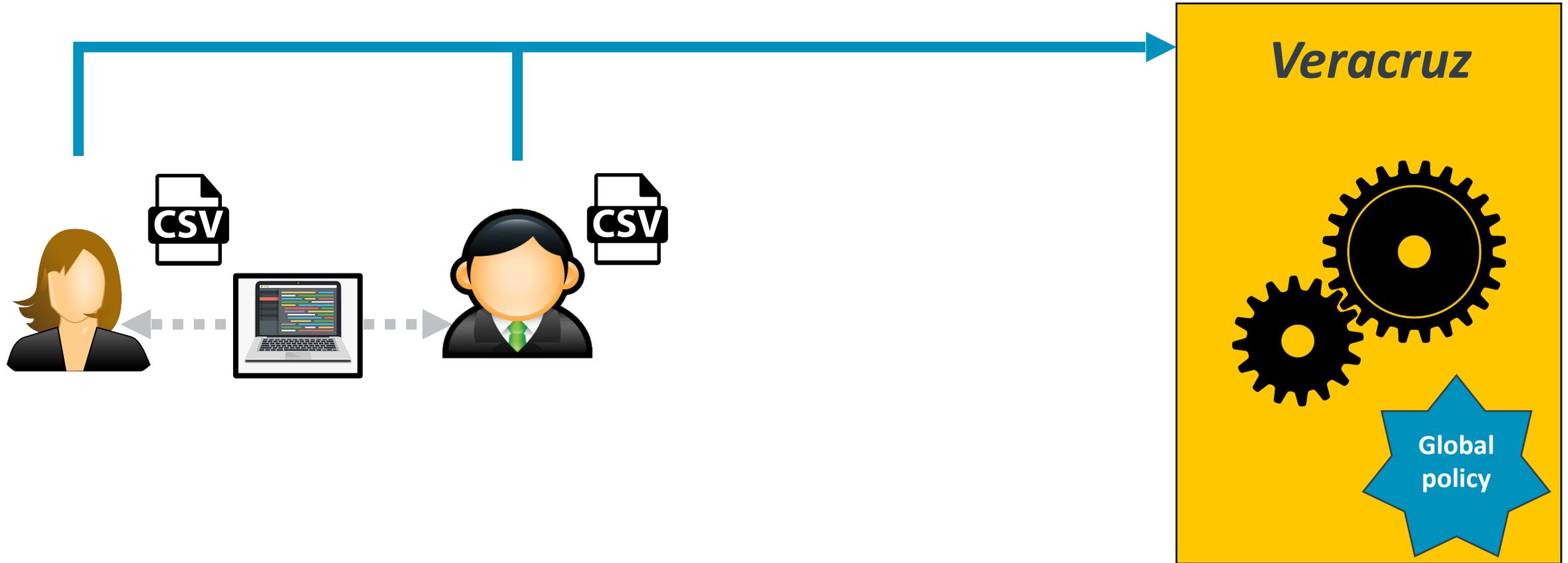
# Use-case: privacy-preserving machine learning



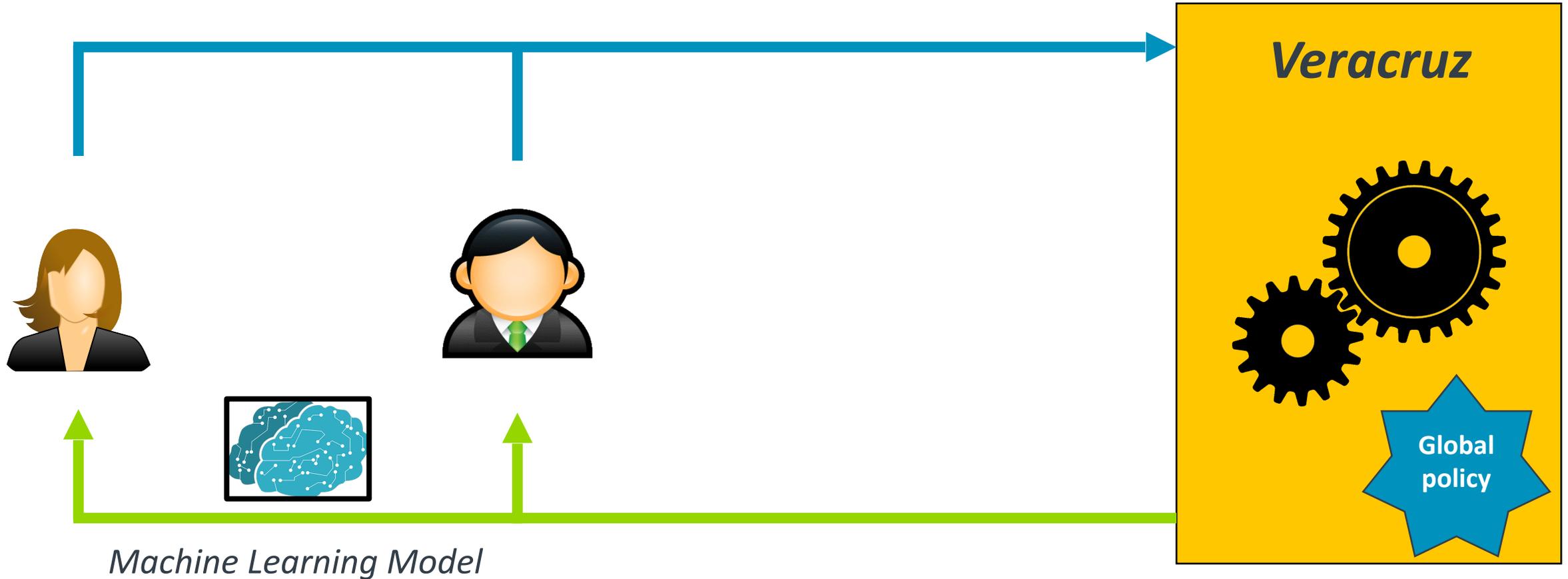
# Use-case: privacy-preserving machine learning



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# Use-case: privacy-preserving machine learning



# Use-case: privacy-preserving set-sum computation



*Internet advertising platform*

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*Client*



# Use-case: privacy-preserving set-sum computation



*Internet advertising platform*

---

*Client*



A45B3201:	£4.99
E3332110:	£34.23
01224573:	£17.50
...	



# Use-case: privacy-preserving set-sum computation



```
A45B3201  
B8920345  
45398A21  
...
```

*Internet advertising platform*

---

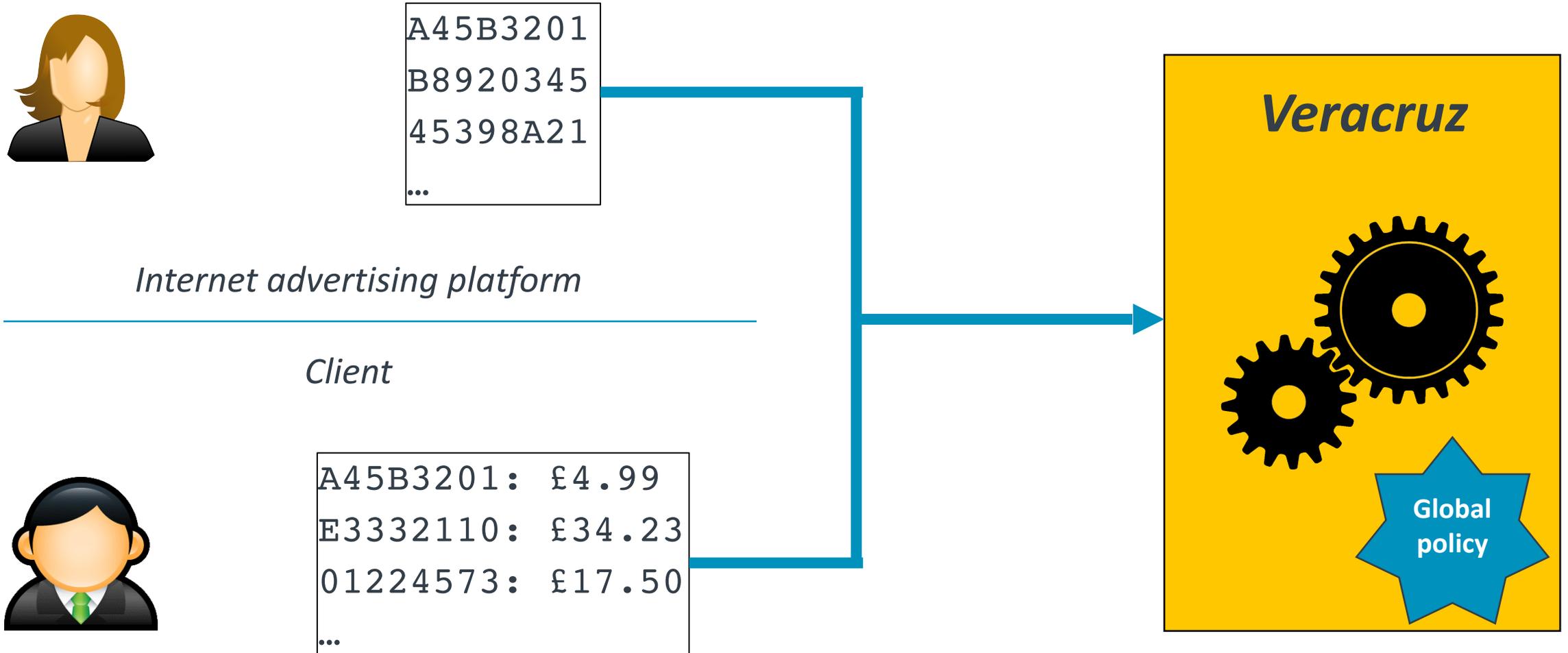
*Client*



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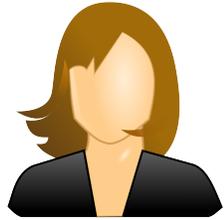
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*Internet advertising platform*

*Client*



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```

$\Sigma$  referred customer spend



## ...and many more potential use-cases

1. IP protection,
  2. Privacy-preserving surveys/auctions/elections,
  3. Privacy-preserving distributed compute: map-reduce/grid computing *a la* SETI@home,
  4. Private search/fuzzy matching,
  5. Provenance tracking for data,
  6. Verifiable computation,
  7. N-way secret sharing,
  8. Fair exchange of documents,
  9. Zero-knowledge proof of knowledge,
  10. Delegating computations from weak devices to untrusted servers,
- ...ad infinitum*

# Abstracting over isolates

Veracruz supports *multiple* different isolation technologies at present:

- **Arm TrustZone** trusted applications,
- **Intel SGX** secure enclaves,
- The high-assurance **seL4 microkernel**,
- **AWS Nitro Enclaves**, ...and maybe more in the future,

representing different points on a *continuum of paranoia*

Veracruz provides abstractions over isolate technologies, with:

- A single, portable programming model based on **WebAssembly**,
- A unified attestation mechanism, based on **Arm's PSA Attestation** protocol, which hides platform-specific attestation protocols from clients

# A few future directions

- Support for streaming computations
- Adoption of a subset of WASI as our ABI
- Multi-isolate use-cases, e.g. privacy-preserving grid-compute, or map-reduce
- Dynamic checking of the runtime behaviour of the program
- Supporting more isolation technologies

# Conclusions

Veracruz is a research project exploring how strong isolation technology and remote attestation can influence the design of novel, data-intensive distributed systems

Veracruz allows users to easily design and deploy collaborative, privacy-preserving computations using a range of software and hardware isolation mechanisms and WASM:

- Arm TrustZone trusted applications,
- Intel SGX enclaves,
- The seL4 high-assurance hypervisor,
- AWS Nitro Enclaves.

Veracruz has many potential applications, which we are only just beginning to explore!

# Get involved

Veracruz is (provisionally) adopted as a project by the *Confidential Compute Consortium*, and all of our development is now out in the open, on Github:

<https://github.com/veracruz-project/veracruz>

We are interested in attracting collaborators to help us drive the project forward. If you're interested in getting involved, e-mail any of the team members or get in touch via Github!

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Thank You

Danke

Merci

谢谢

ありがとう

Gracias

Kiitos

감사합니다

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