



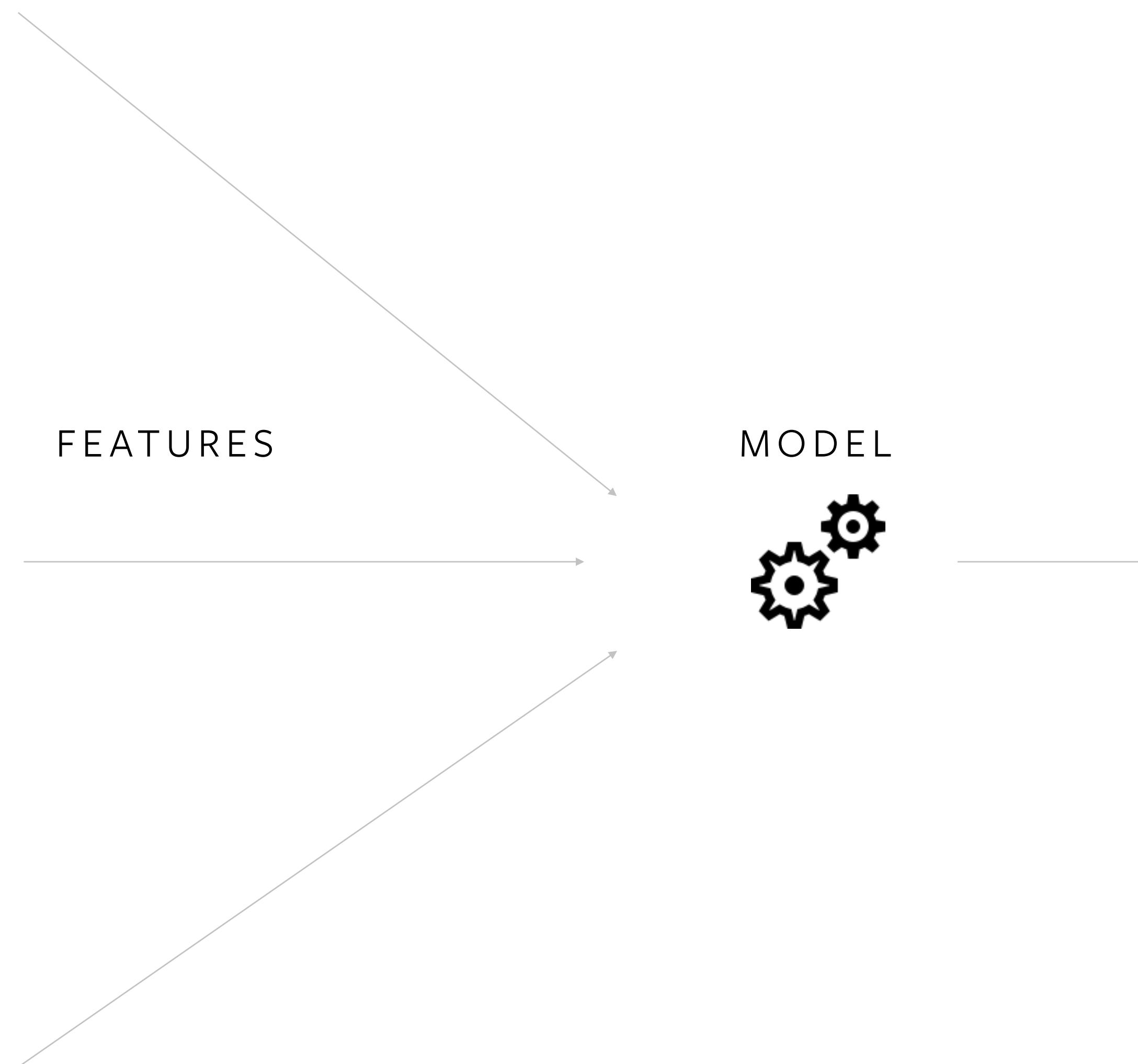
CRYPTEN

Machine Learning on Encrypted Data with CrypTen



CRYPTEN

What is machine learning?



FEATURES

MODEL



LABELS

cat or dog

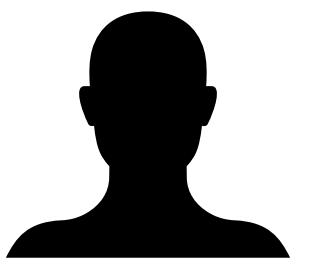
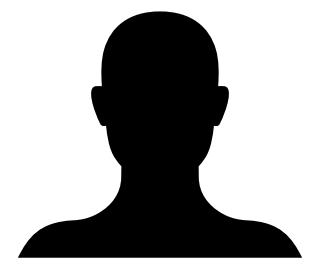


cat or dog

MULTIPLE PARTIES



MODEL

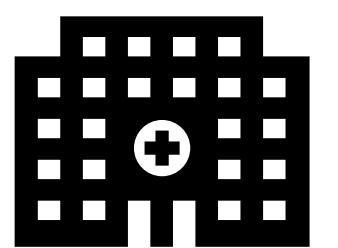
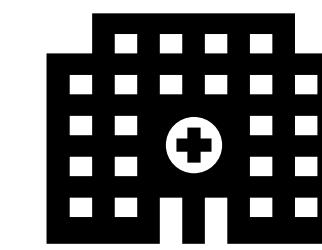
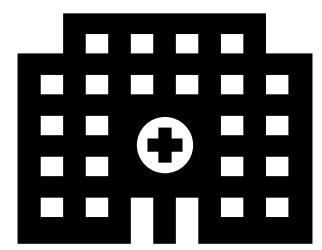




WHAT ABOUT SENSITIVE DATA?

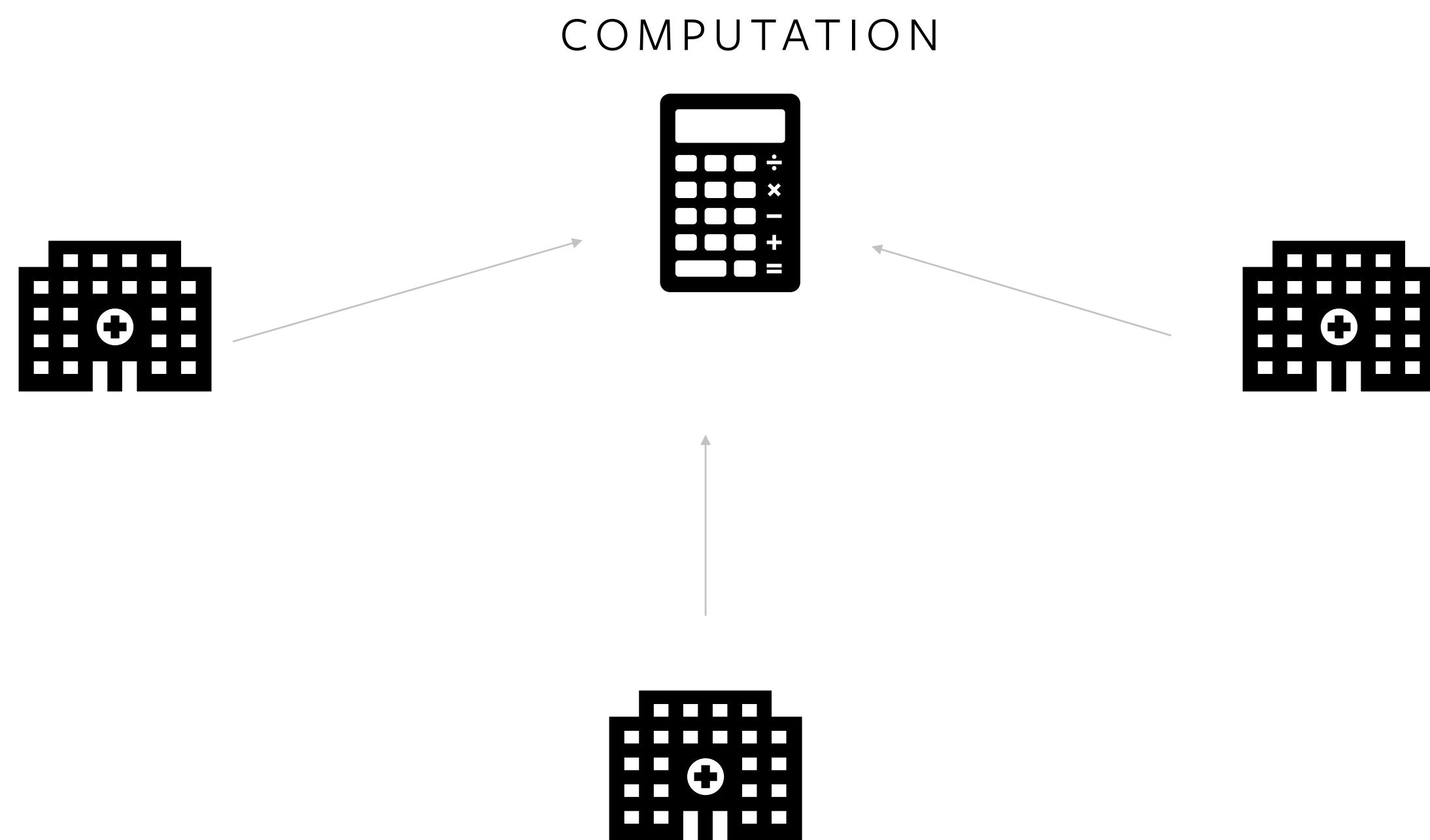
?

MODEL



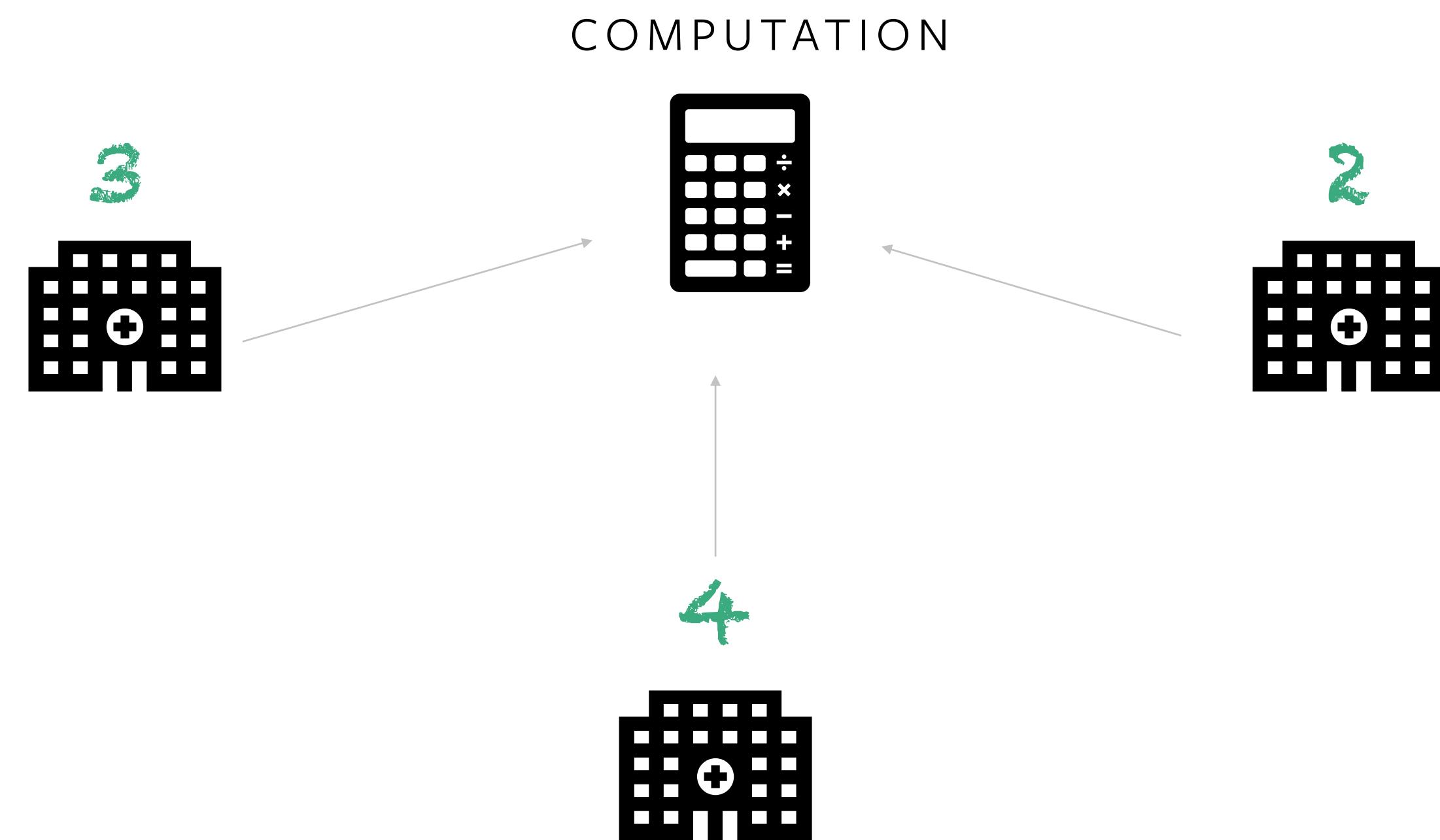


SECURE MULTI-PARTY COMPUTATION



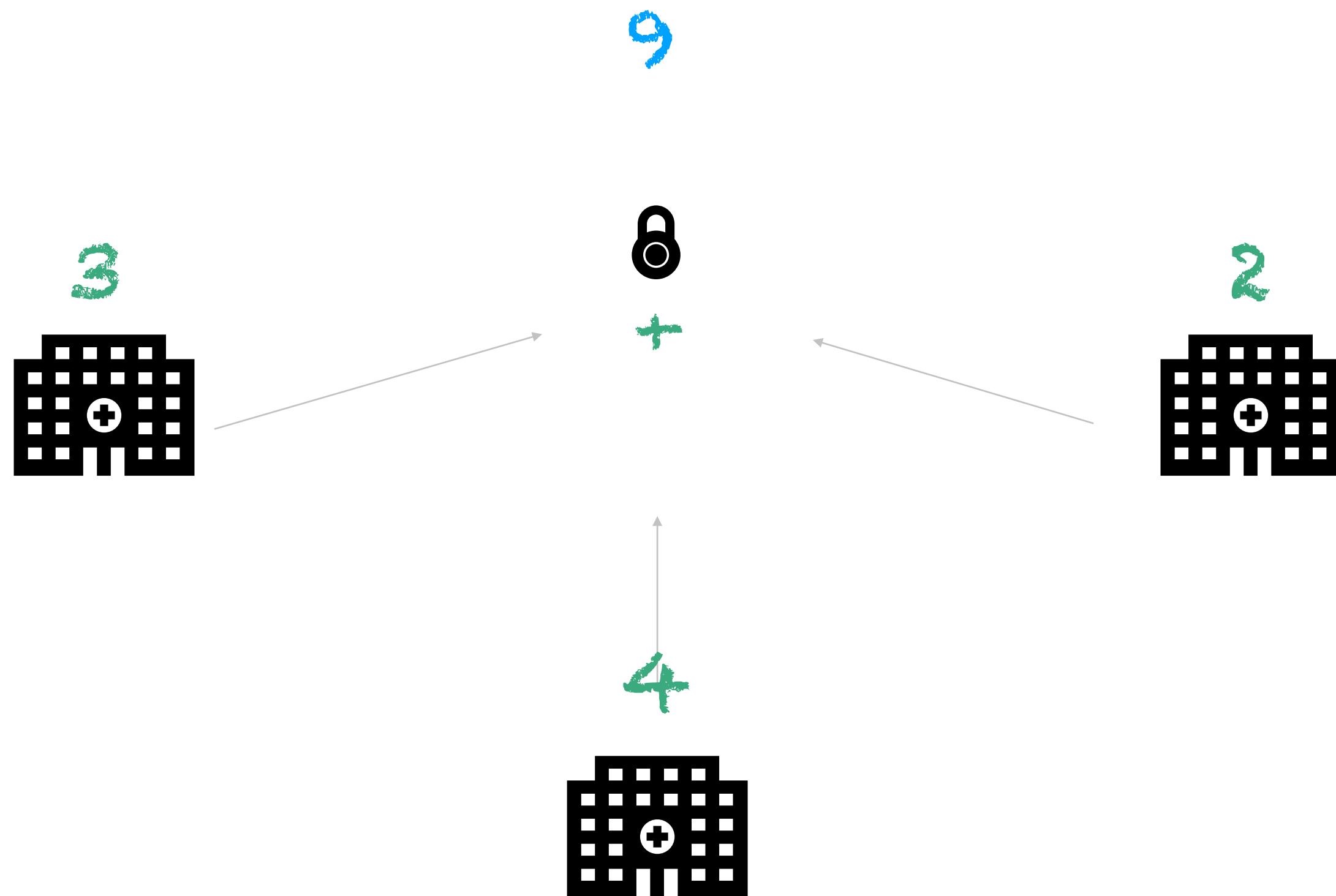


SECURE MULTI-PARTY COMPUTATION





SECURE MULTI-PARTY COMPUTATION

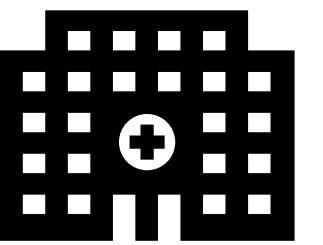
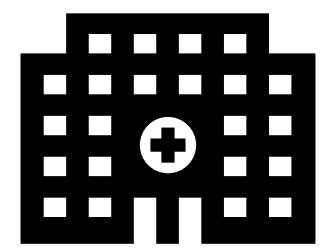
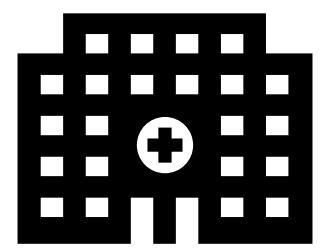




SECURE COMPUTATION & MACHINE LEARNING

?

MODEL

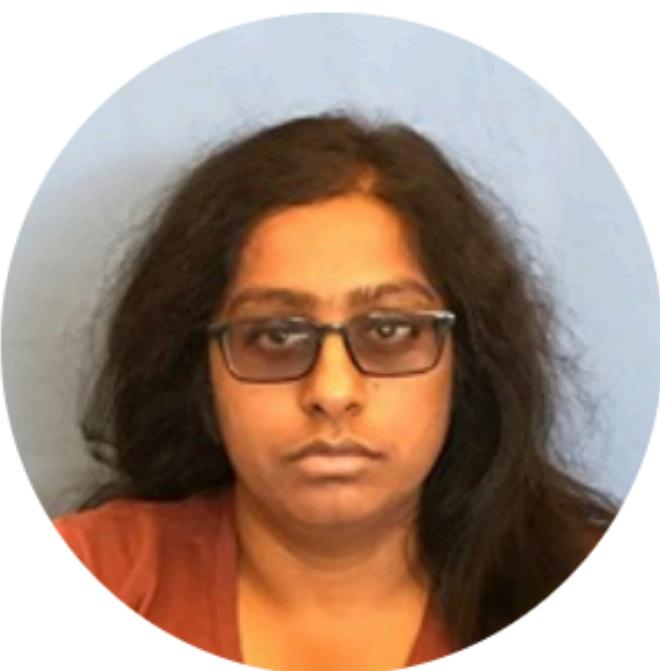




TEAM



Brian Knott



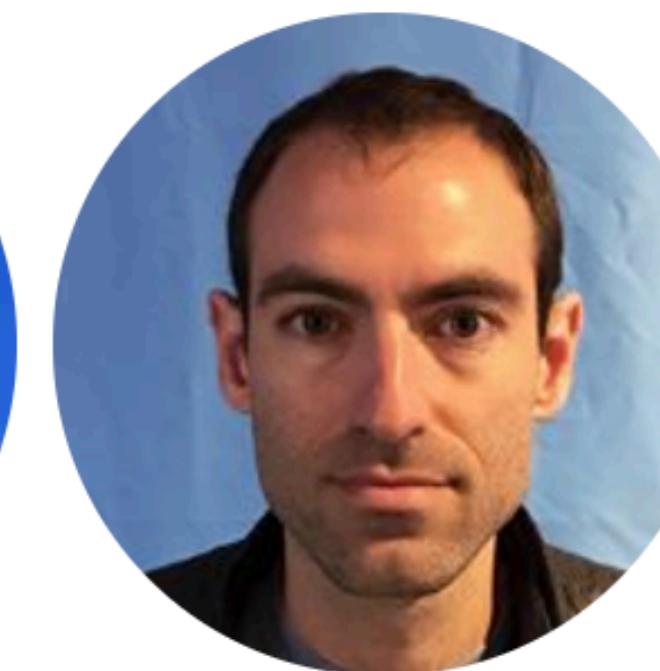
Shobha Venkataraman



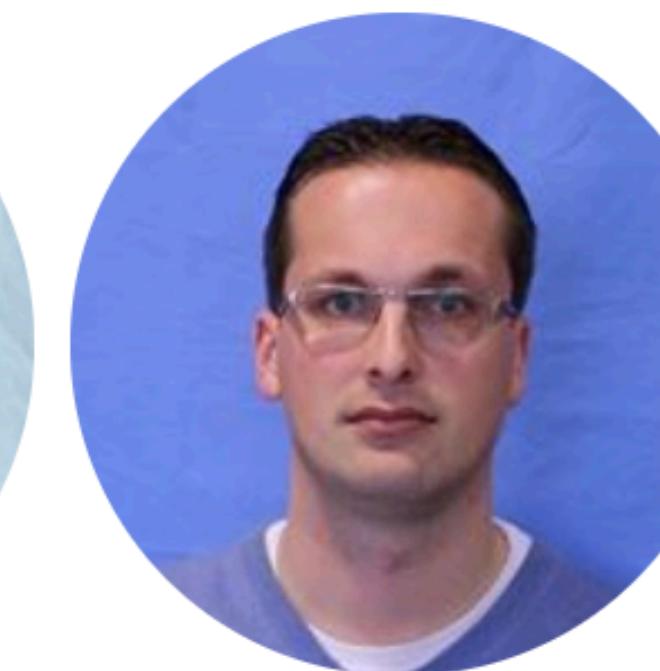
Mark Ibrahim



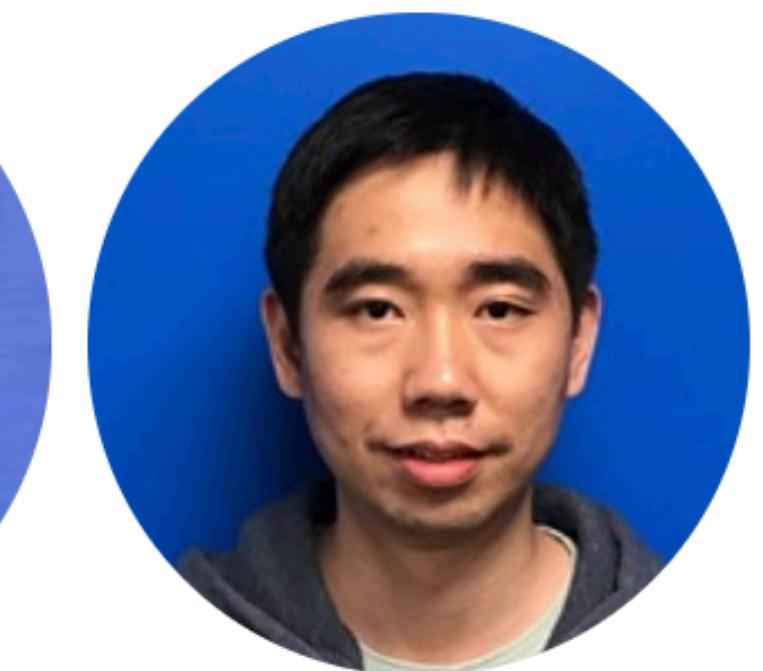
Shubho Sengupta



Awni Hannun



Laurens van der Maaten



Xing Zhou

INTRODUCING



Crypten



WHAT IS CRYPTEN?

CrypTen is a research platform joining

machine learning & secure-computation

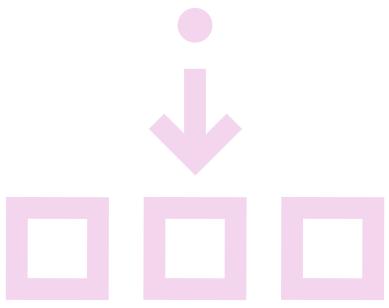


DESIGN PRINCIPLES



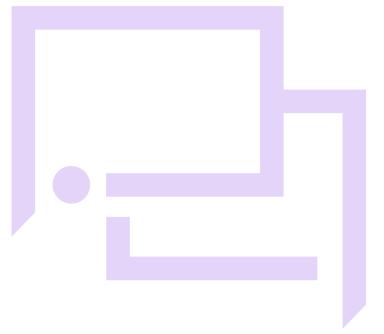
MACHINE-LEARNING FIRST

Hello **CrypTensor!**



EAGER EXECUTION

No compilers! Easy debugging and learning.



REALISTIC

Parties and communication are real.

PyTorch

1. Make a **Tensor**.

```
x = torch.tensor([1.0, 2.0, 3.0])
```

2. Add Tensors

```
x + y
```

3. Multiply Tensors

```
z = x * y  
print(z)
```

CrypTen

1. Make a **CrypTensor**.

```
x_enc = crypten.cryptensor([1.0, 2.0, 3.0]) # encrypts tensor
```

2. Add **CrypTensors**

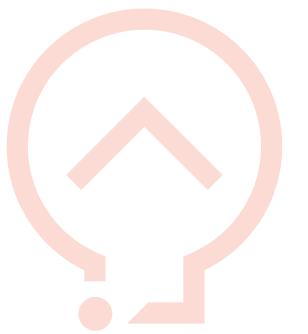
```
x_enc + y_enc
```

3. Multiply **CrypTensors**

```
z = x_enc * y_enc  
print(z.get_plain_text()) # decrypt
```

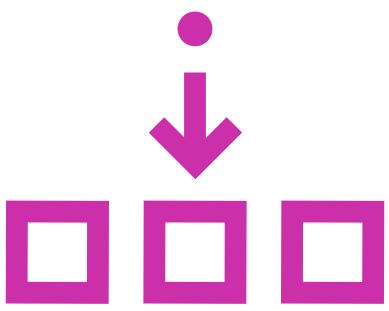


DESIGN PRINCIPLES



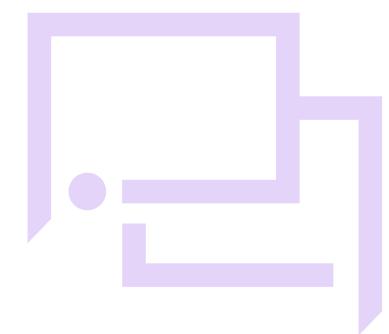
MACHINE-LEARNING FIRST

Hello CrypTensor!



EAGER EXECUTION

No compilers! Easy debugging and learning.

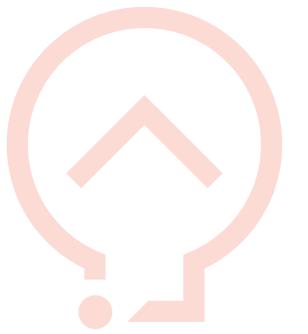


REALISTIC

Parties and communication are real.

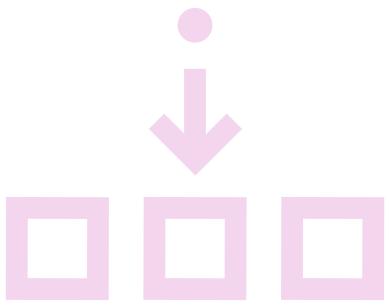


DESIGN PRINCIPLES



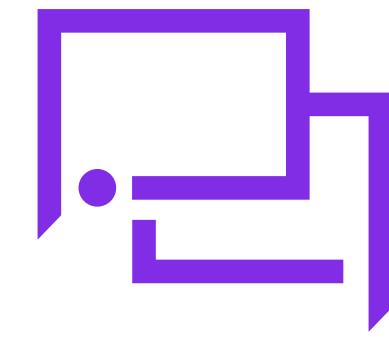
MACHINE-LEARNING FIRST

Hello CrypTensor!



EAGER EXECUTION

No compilers! Easy debugging and learning.



REALISTIC

Parties and communication are real.



HELLO CRYPTENSOR

1. Make a **CrypTensor**.

```
import crypten

crypten.init()                      # sets up communication

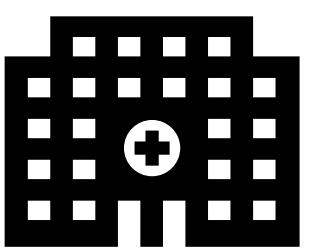
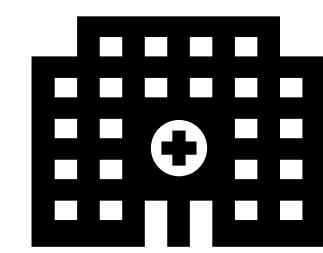
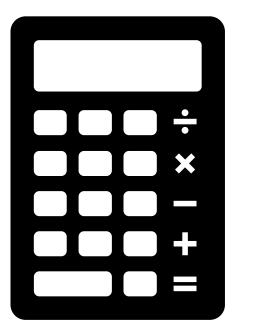
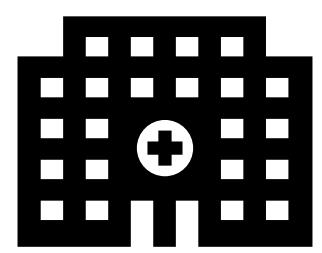
x_enc = crypten.cryptensor([1.0, 2, 3]) # encrypts tensor

x_dec = x_enc.get_plain_text()         # decrypts tensor
```



SECURE MULTI-PARTY COMPUTATION

COMPUTATION

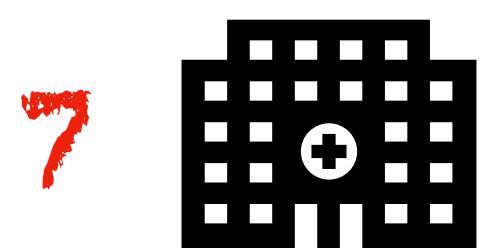




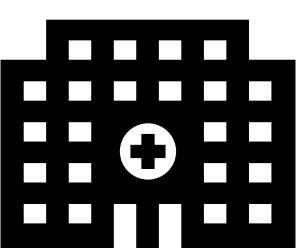
INTUITION: SECURE MULTI-PARTY COMPUTATION

SECURE ADDITION:

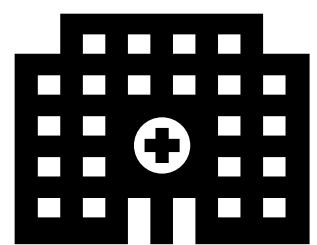
$$7 + 10$$



PARTY A



PARTY C

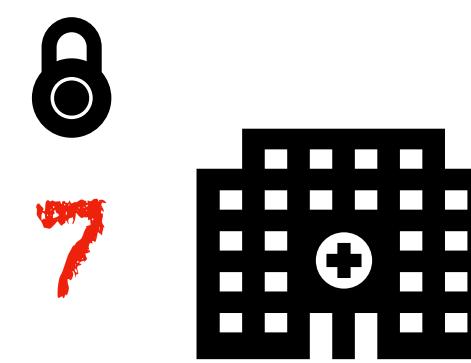


PARTY B

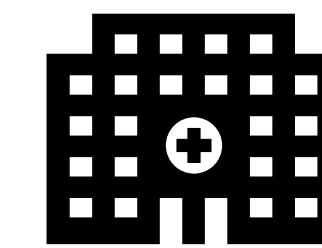


INTUITION: SECURE MULTI-PARTY COMPUTATION

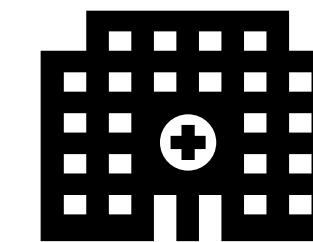
PARTY A SHARES AN ENCRYPTED VALUE



PARTY A



PARTY C

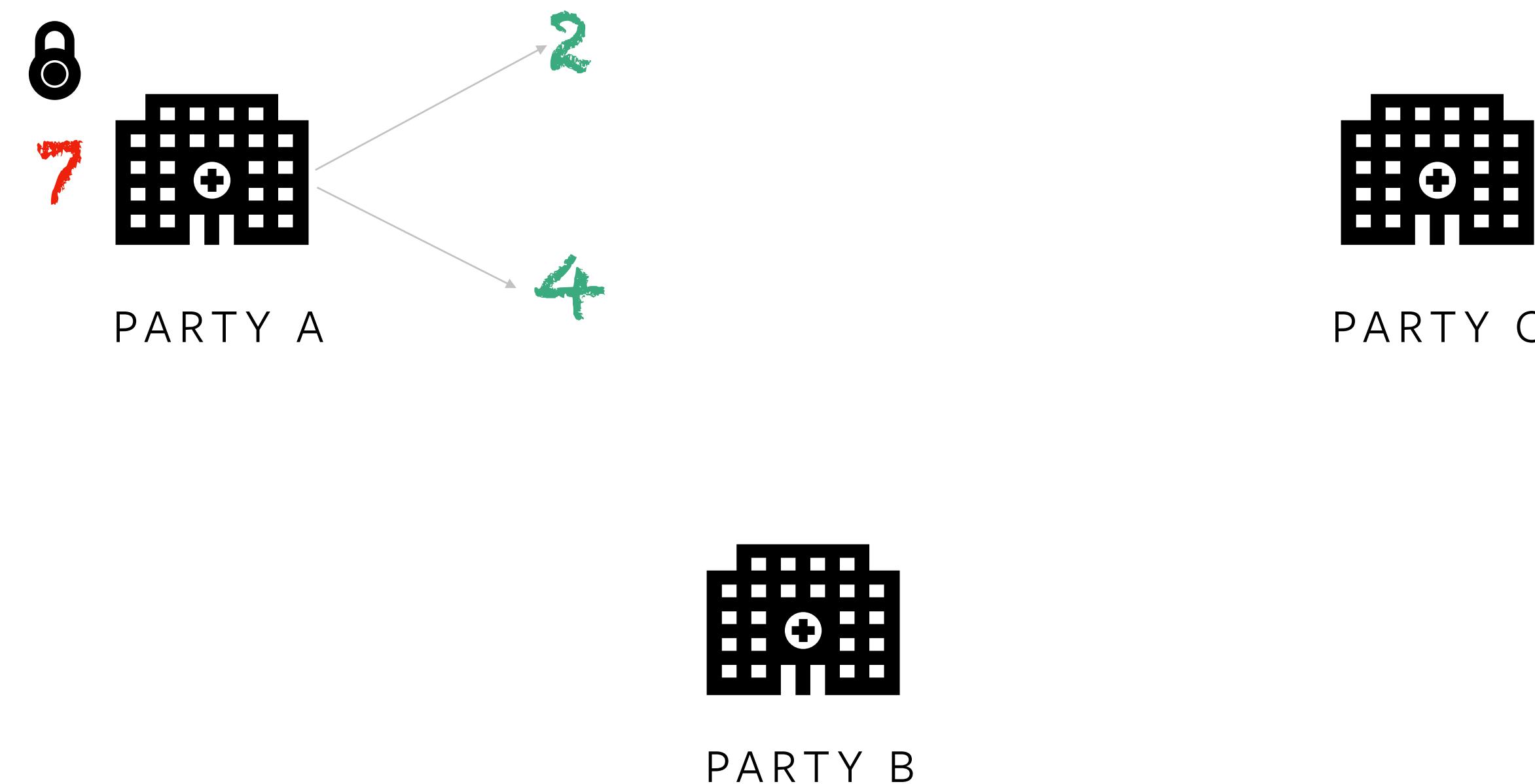


PARTY B



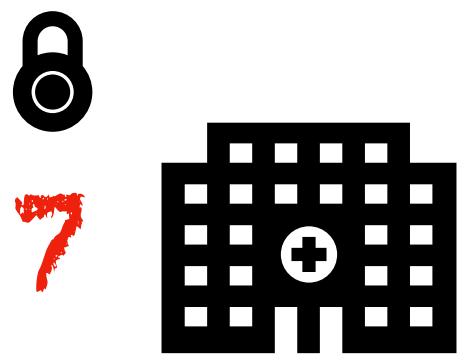
INTUITION: SECURE MULTI-PARTY COMPUTATION

PARTY A SHARES AN ENCRYPTED VALUE

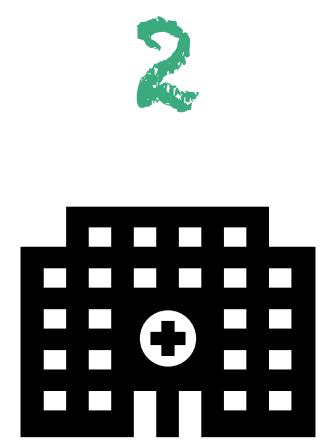




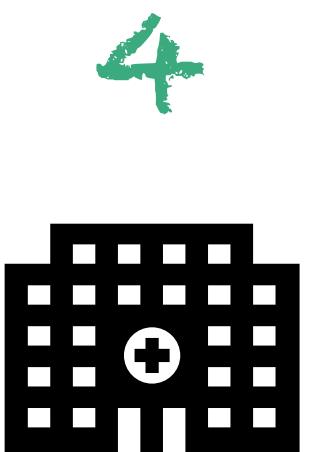
INTUITION: SECURE MULTI-PARTY COMPUTATION



PARTY A



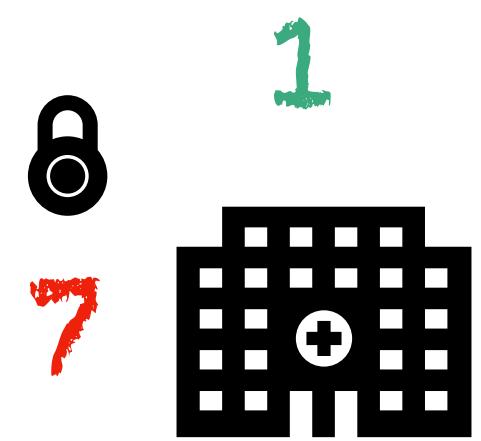
PARTY C



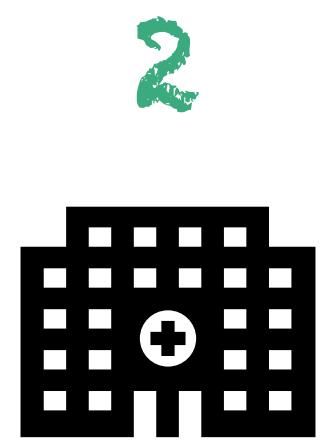
PARTY B



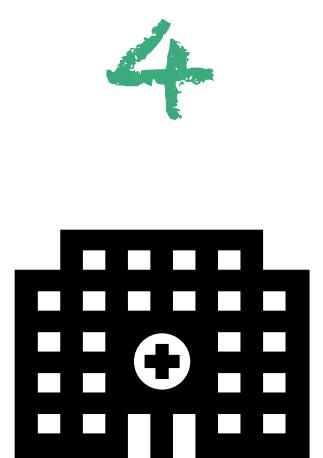
INTUITION: SECURE MULTI-PARTY COMPUTATION



PARTY A



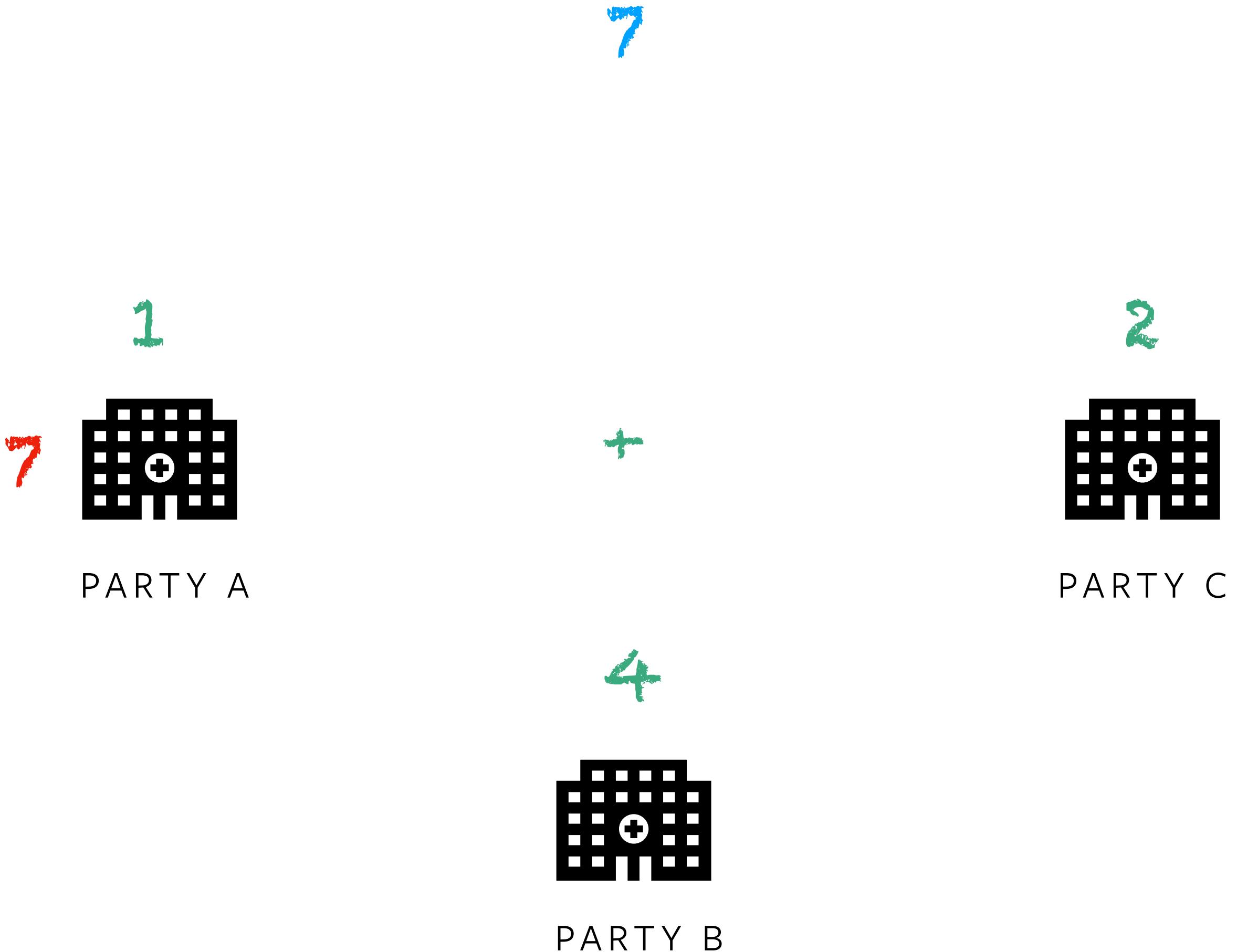
PARTY C



PARTY B



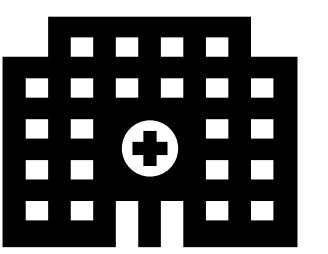
INTUITION: SECURE MULTI-PARTY COMPUTATION





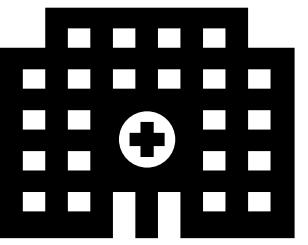
INTUITION: SECURE MULTI-PARTY COMPUTATION

3



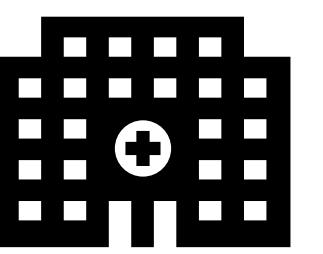
PARTY A

2



PARTY B

5



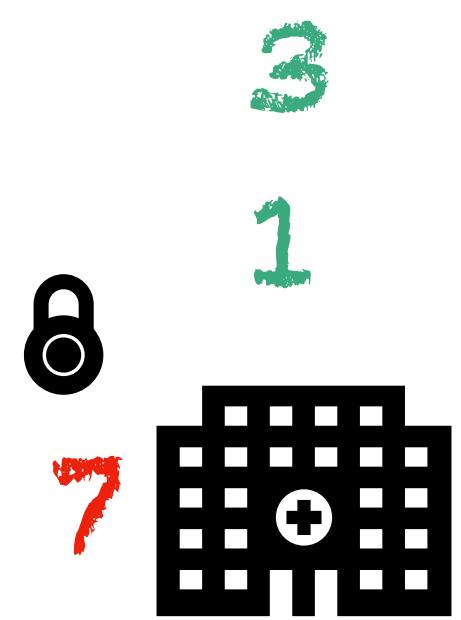
PARTY C



10

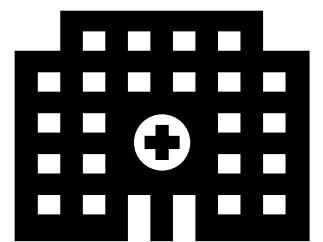


INTUITION: SECURE MULTI-PARTY COMPUTATION

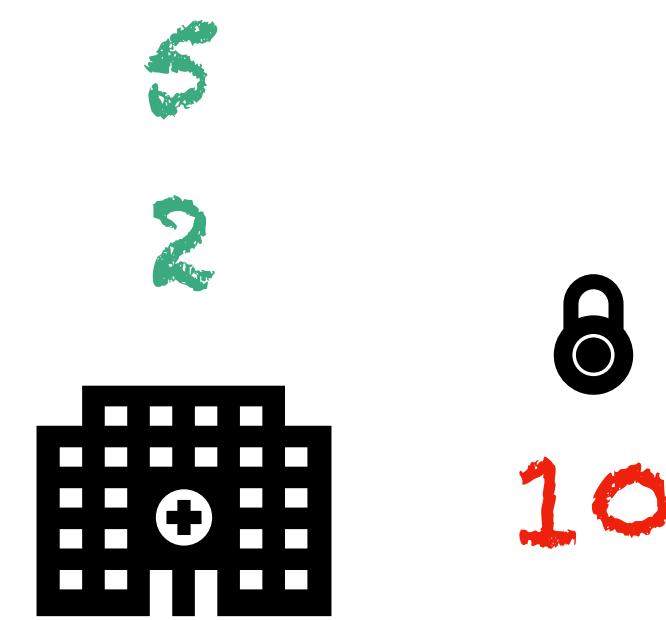


PARTY A

2
4



PARTY B



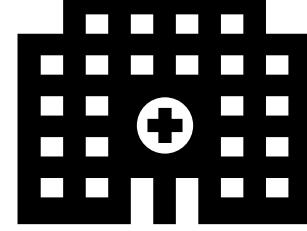
PARTY C

8
10



INTUITION: SECURE MULTI-PARTY COMPUTATION

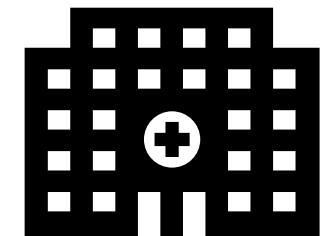
$$\begin{array}{r} 3 \\ + \quad = 4 \\ \hline \end{array}$$

6
7 

PARTY A

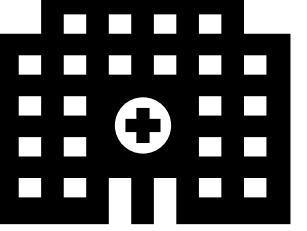
$$\boxed{17}$$

$$\begin{array}{r} 2 \\ + \quad = 6 \\ \hline 4 \end{array}$$



PARTY B

$$\begin{array}{r} 5 \\ + \quad = 7 \\ \hline \end{array}$$

2
 8
10 

PARTY C



ENCRYPTED TRAINING

1. Make a **CrypTen Model.**
2. Encrypt Data
3. Train!

```
import crypten

crypten.init() # sets up communication

class LogisticRegression(crypten.nn.Module):

    def __init__(self):
        super().__init__()
        self.linear = crypten.nn.Linear(28 * 28, 10)

    def forward(self, x):
        return self.linear(x)

model = LogisticRegression().encrypt() # encrypts tensor
```



Training Across Parties

1. Join **Encrypted Data**
2. Encrypt Model
3. Train!

```
import crypten

crypten.init()                                # sets up communication

alice_images_enc = crypten.load("/tmp/data/alice_images.pth", src=ALICE)
bob_labels_enc = crypten.load("/tmp/data/bob_labels.pth", src=B0B)

model = LogisticRegression().encrypt()
train_model(model, alice_images_enc, bob_labels_enc)
```



C R Y P T E N



crypten.ai

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