

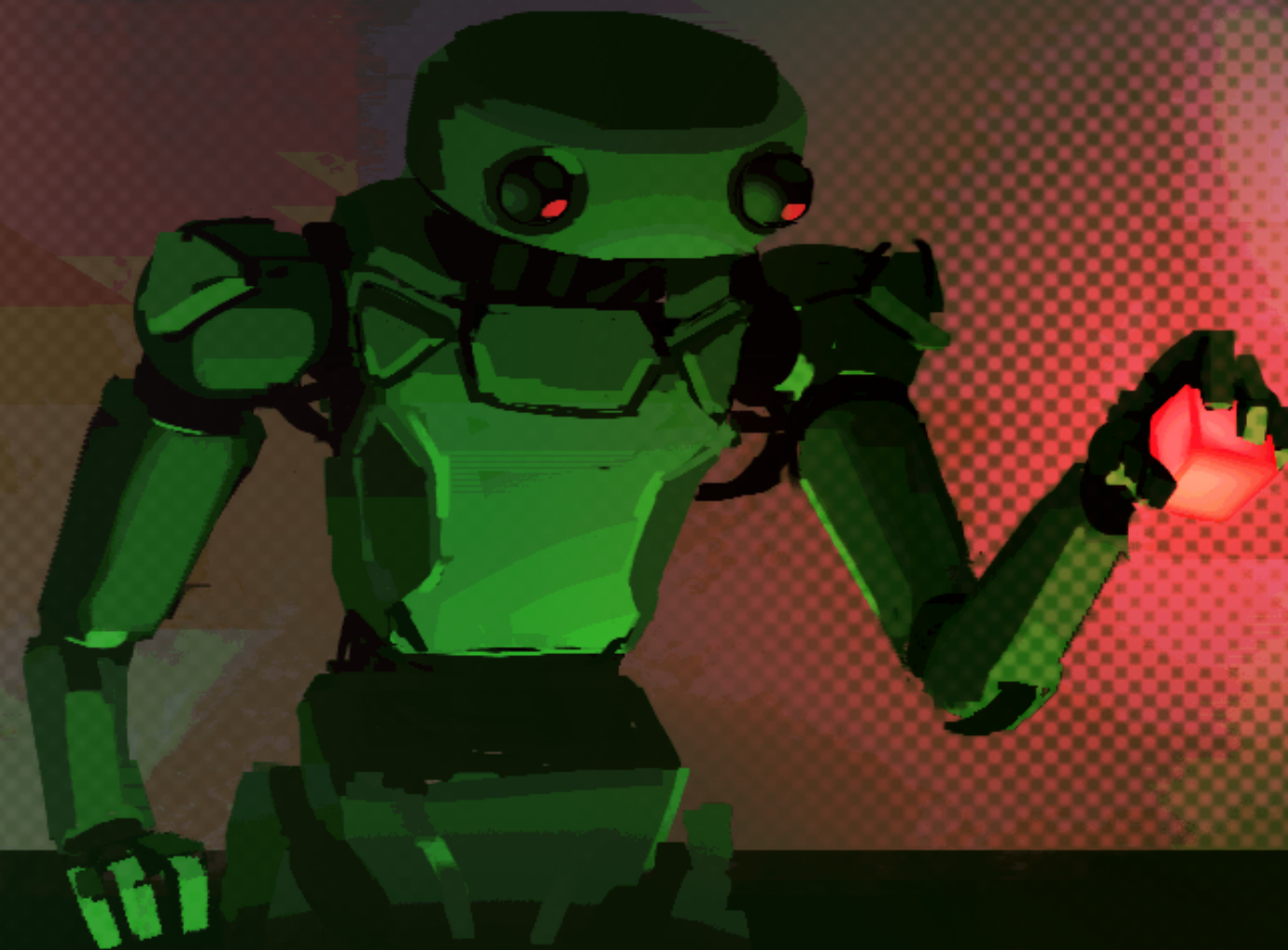
# Automated design of photonic experiments for device-independent quantum key distribution

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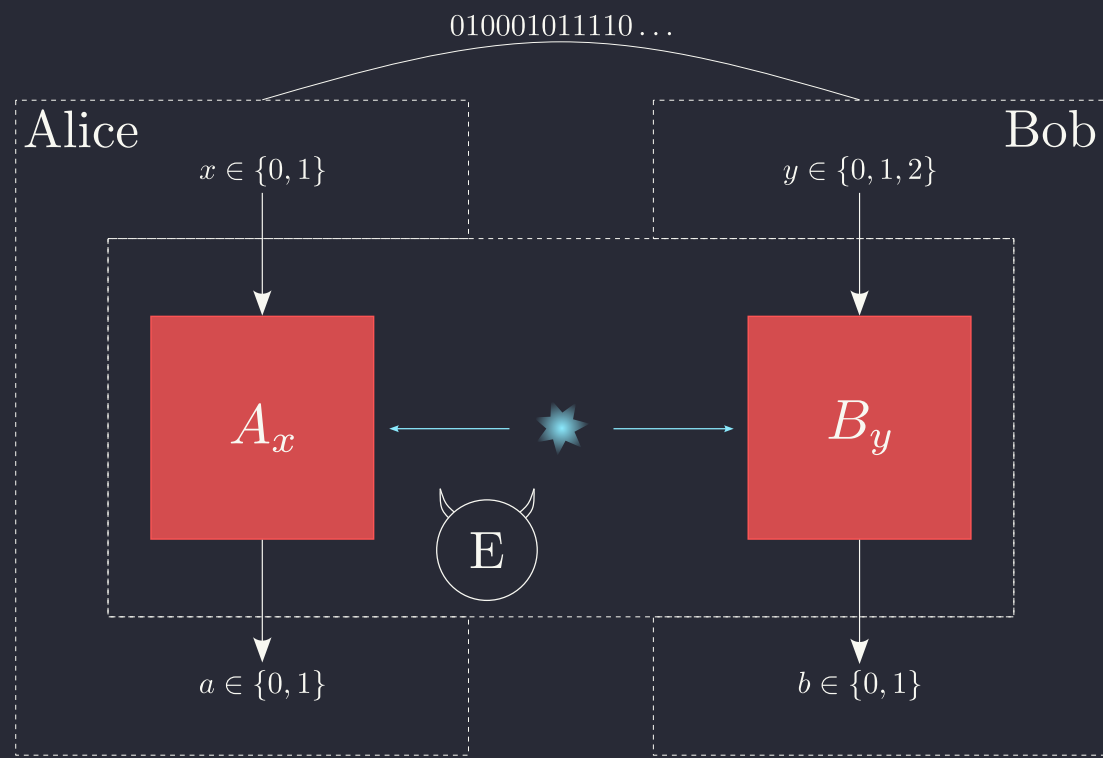
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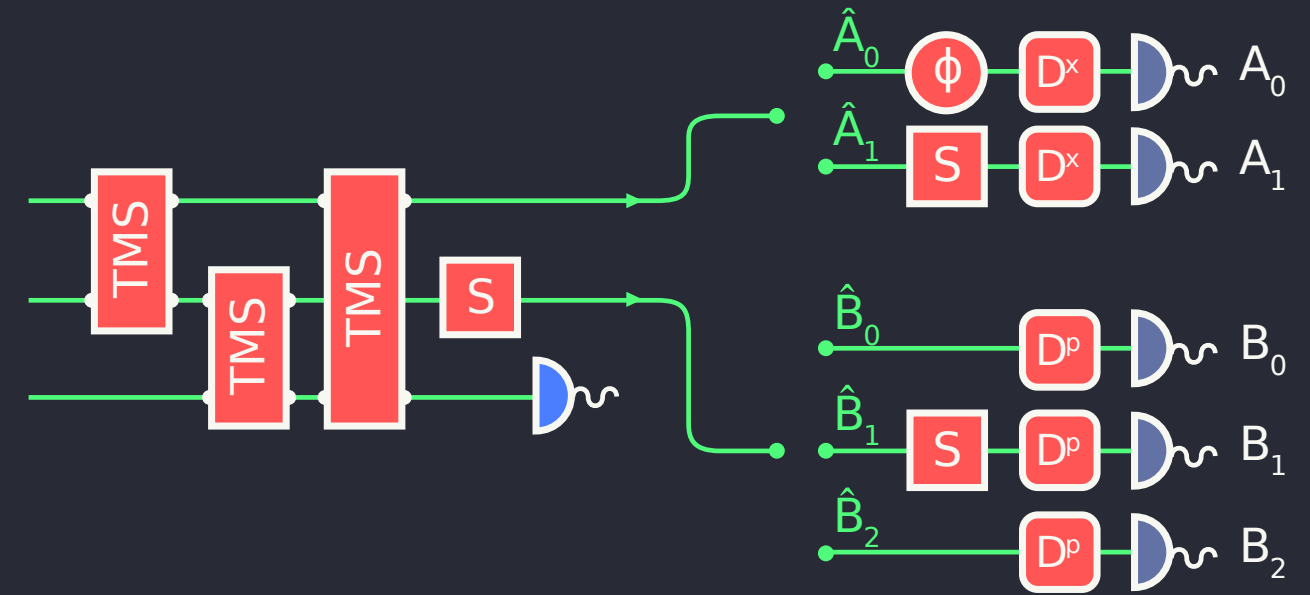
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arXiv:2209.06468

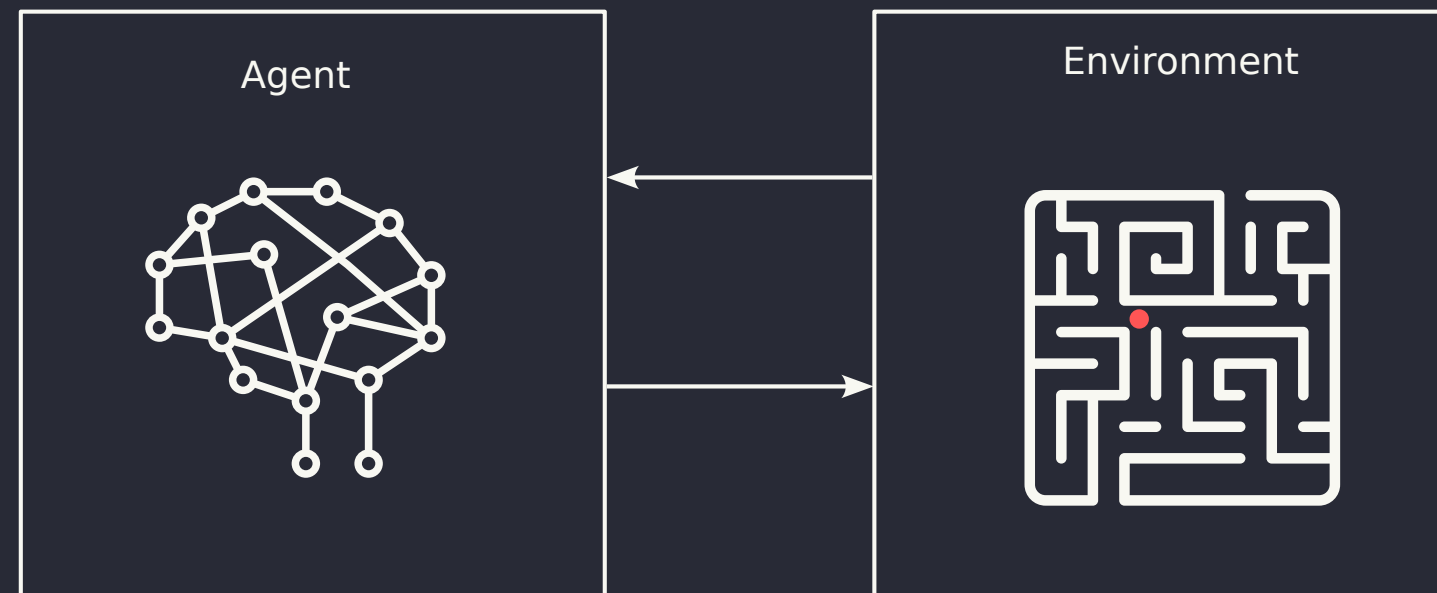
# From Classical to Quantum Cryptography



# Quantum Optical Circuits

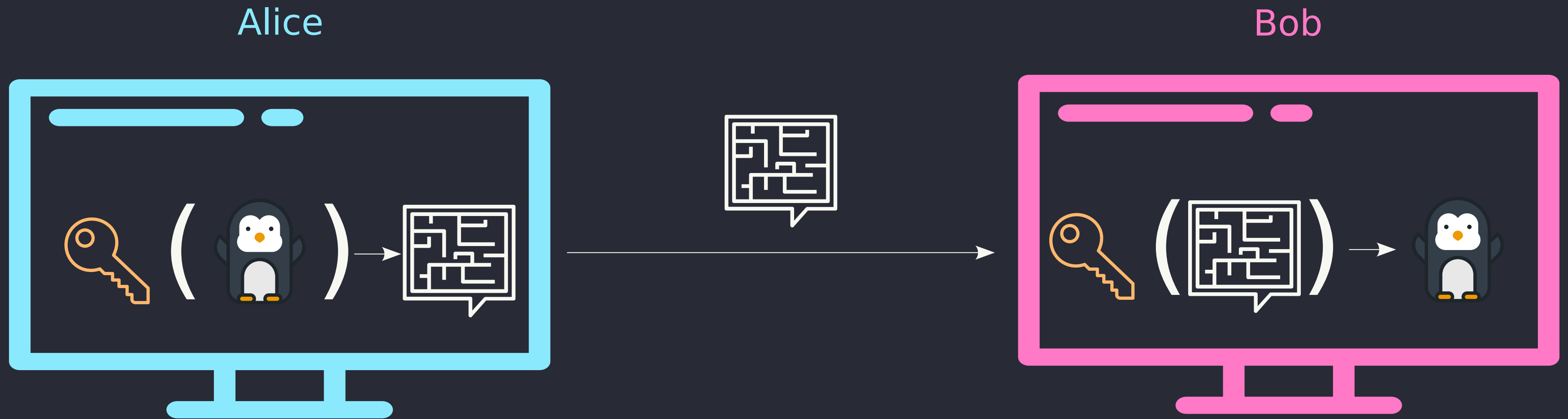


# Reinforcement Learning





# From Classical cryptography...



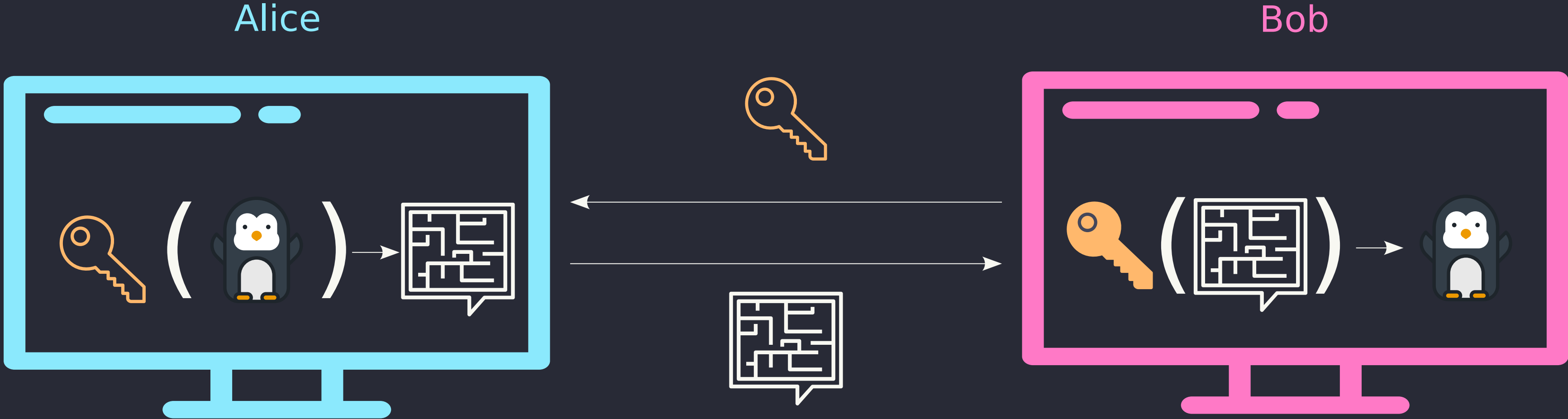
## Symmetric cryptography:

Alice and Bob share the same key  used to en/de-encrypt the message

✓ Information-theoretically secure

✗ Impractical:  $\text{size}(\text{key}) == \text{size}(\text{message})$ , key has to be preshared

From Classical cryptography...



Asymmetric cryptography:

Bob has a private key  and shares a public key 

✓ Practical, no need for a pre-shared keys of size  $(\text{penguin})$

✗ Cryptography proof relying on computational assumption  
Can be hacked using a quantum computer [Gouzien et. al., PRL 127 (14)]

# ... to Quantum Cryptography

Quantum key distribution:

Use quantum resources to generate and distribute a symmetric key 

Key is provably secure (unknown to a third party, Eve)

BB84:

Key encoded in the polarization of photons



QKD relies on a small set of assumptions:

- ✓ The devices used to generate the key behave according to quantum theory
- ✓ Alice and Bob have access to random numbers
- ✓ Alice and Bob labs are isolated (no information leakage)
- ✓ Classical information is performed on trusted computers
- ✗ Their quantum devices are trusted and perfectly calibrated

→ Can be hacked (side channel attack) [F. Xu et al., Rev. Mod. Phys. 92]

# Device-independent quantum key distribution

Device-independent:

No assumptions made on the quantum devices

DIQKD, principles:

Entanglement-based

Maximally entangled state

Measurement outcomes are unpredictable to any third party

Measurement outcomes are strongly correlated

$$H(\text{key} \mid \text{NSA}) = 1$$

$$H(\text{key} \mid B) = 0$$

Bell tests are used as a security statement

# DIQKD protocol

010001011110 ...

Alice

Bob

$\hat{A}_x$



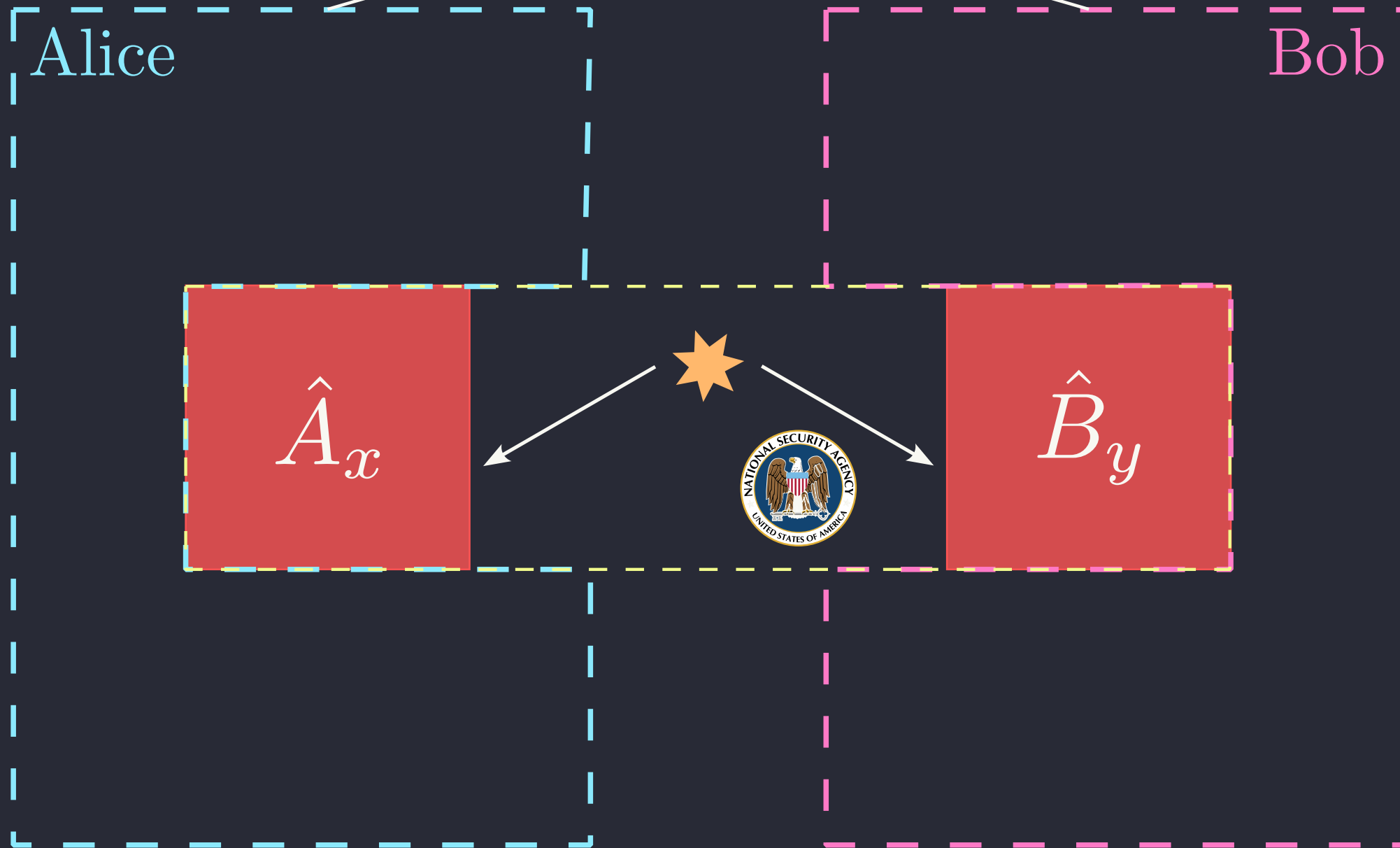
$\hat{B}_y$



# DIQKD protocol

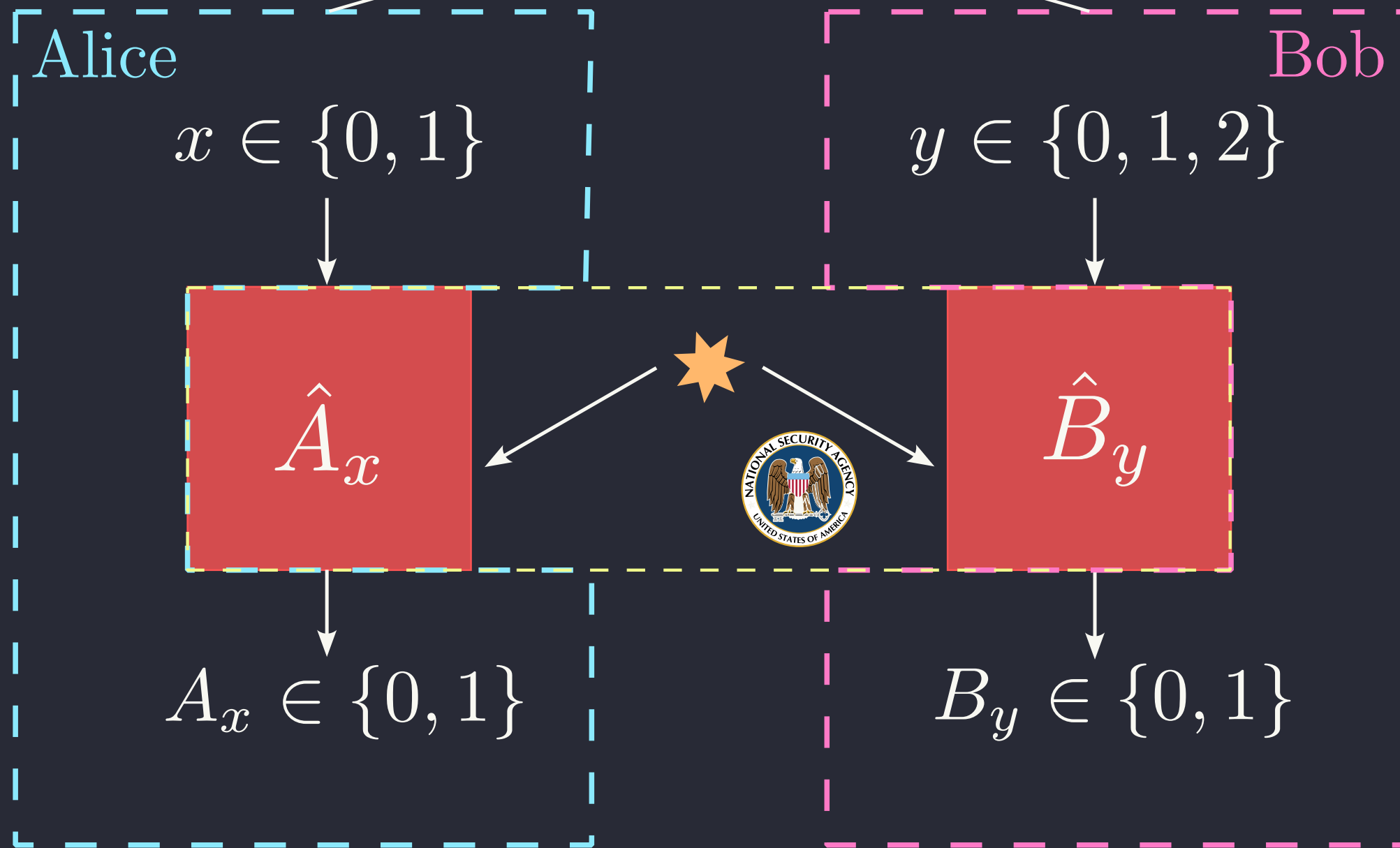
At each round an entangled state  is distributed to Alice and Bob

010001011110 ...



# DIQKD protocol

010001011110 ...



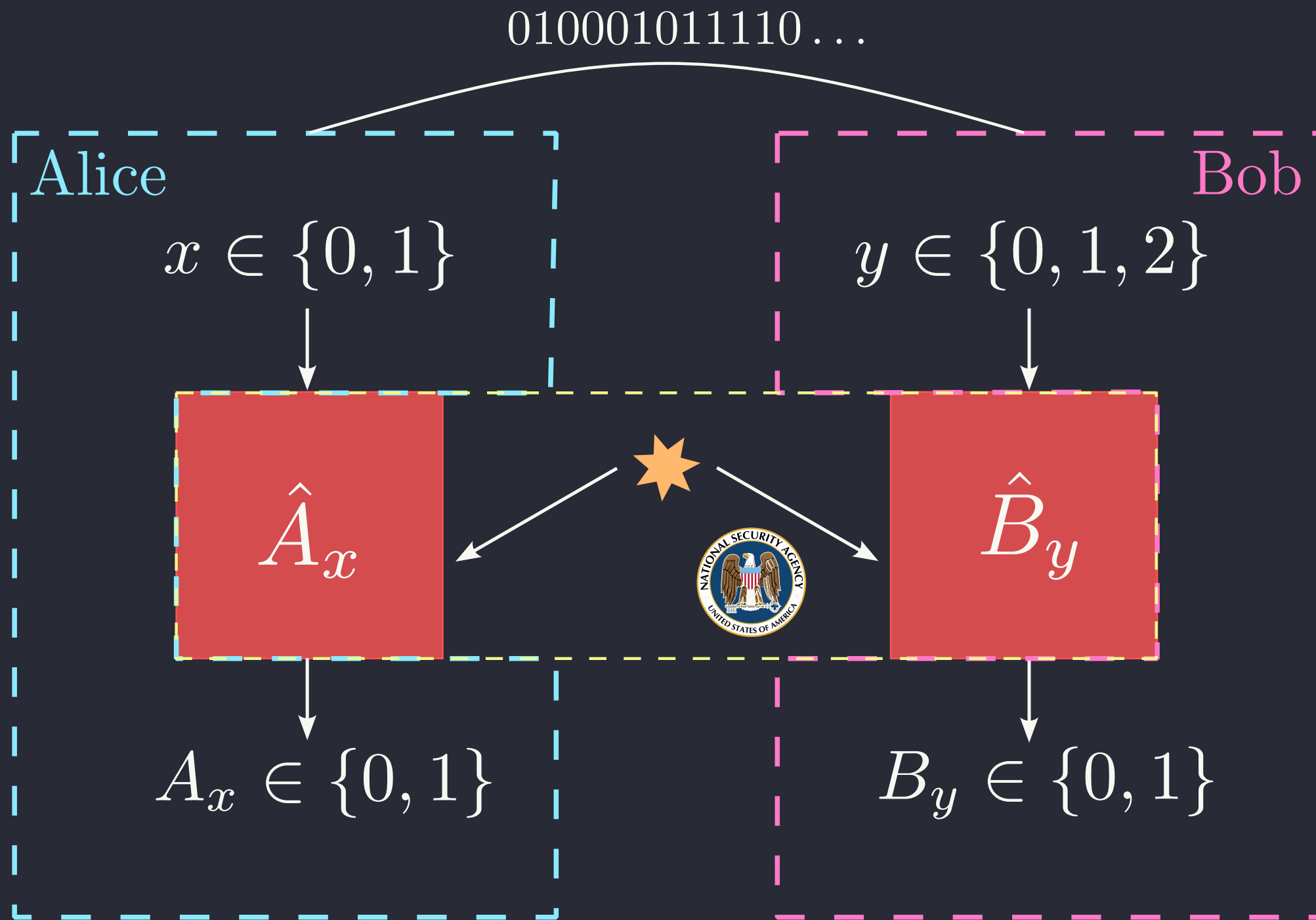
At each round an entangled state  is distributed to Alice and Bob

Alice and Bob randomly chose a measurement setting  $x, y$

They measure  using measurements  $\hat{A}_x, \hat{B}_y$

Outcomes  $A_x, B_y$  are recorded

# DIQKD protocol



Two types of rounds:

**Test round**  $\longrightarrow$  Bell test

$\hat{A}_0, \hat{A}_1, \hat{B}_0, \hat{B}_2$  are used to compute the CHSH score

$$S = \langle \hat{A}_0 \hat{B}_0 \rangle + \langle \hat{A}_0 \hat{B}_1 \rangle + \langle \hat{A}_1 \hat{B}_0 \rangle - \langle \hat{A}_1 \hat{B}_1 \rangle$$

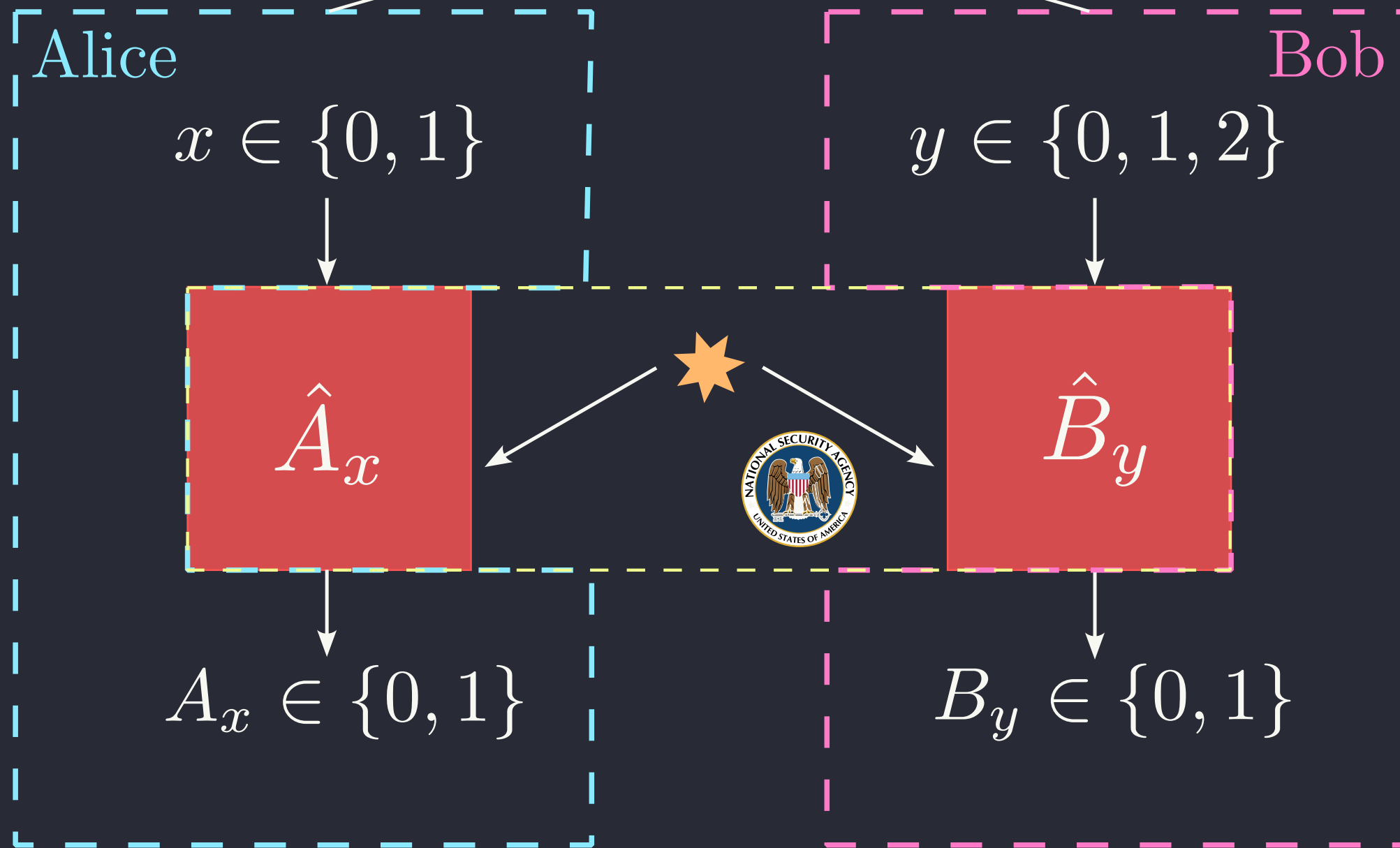
**Key generation round**  $\longrightarrow$  

 generated from  $A_0$

Bob tries to guess  using  $B_2$

# DIQKD protocol

010001011110 ...



**Key rate:** number of secure key bit that can be extracted per round

In the asymptotic limit of a large number of round

$$r = H(\text{key} | \text{NSA}) - H(\text{key} | B)$$

can be bounded using the CHSH score

$$\leq 1 - f(S)$$

# DIQKD Implementation

What's needed:

Generation of entangled states to obtain high CHSH score and correlated keys

High frequency of state generation to obtain a sufficient number of round in a limited time

## Proof-of-concept

### Trapped ion

first DIQKD experiment

[D. Nadlinger et al., Nature 607, 682]

### Single atom

extend DIQKD over ~100m

[W. Zhang et al., Nature 607, 687]

## Practical / Commercial

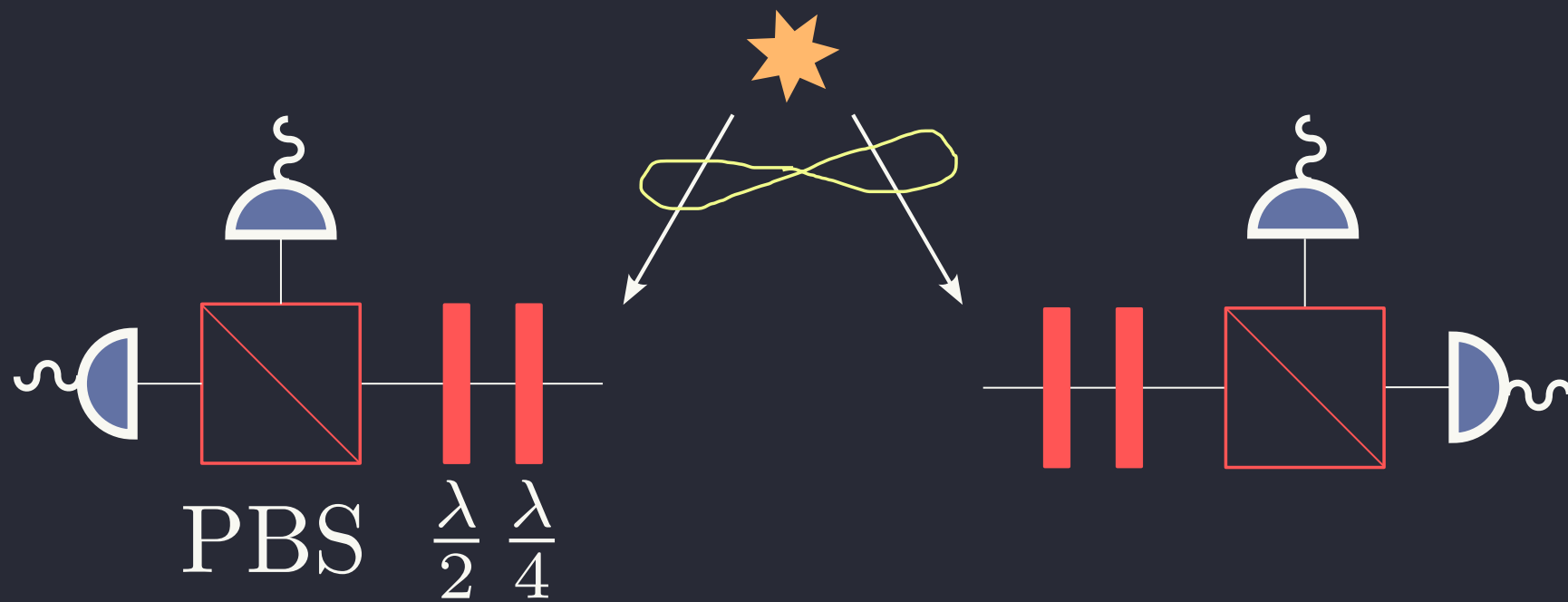
Photonic platform seems promising

- ✓ Bell-CHSH game already implemented
- ✓ High state-generation rate
- ✓ Capacity to implement complex circuit
- ✗ Low CHSH score
- ✗ Susceptible to losses

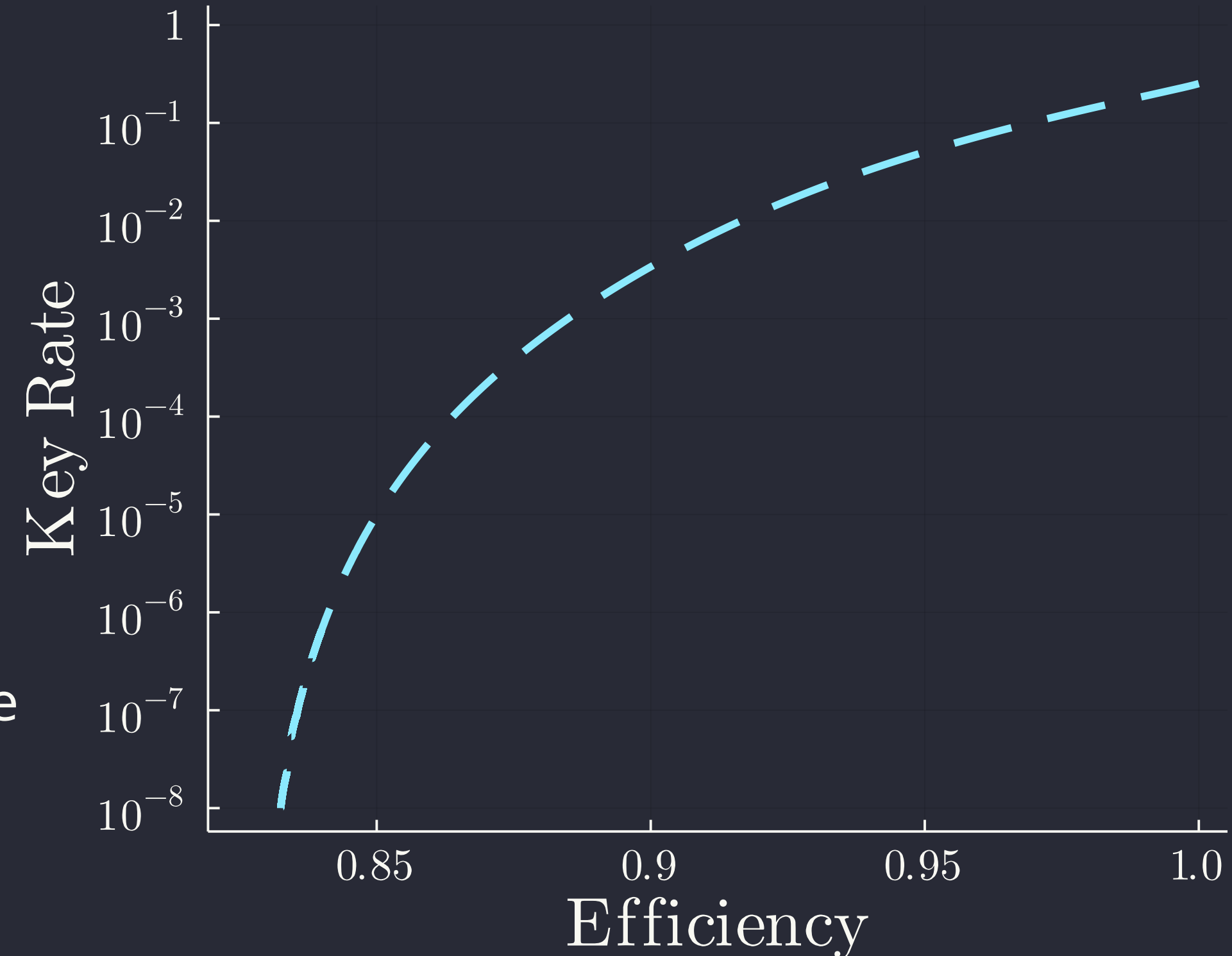


# A DIQKD Implementation: SPDC source

"Standard" implementation to realize Bell tests is using a **SPDC** source generating photons entangled in polarization



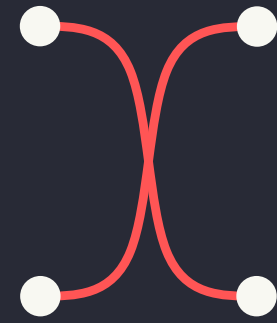
Yield a key rate of  $\sim 0.2522$  in the ideal case  
Positive key rate for min  $\sim 82.6\%$  efficiency



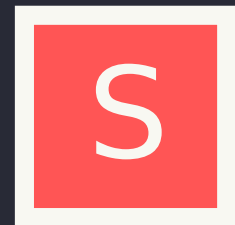
# Quantum Optics: operations



Two-mode Squeezer



Beam-splitter



Single-mode squeezer



Phase-shifter



Displacement (in p)



Displacement (in x)



Heralding



Photo-detection (NPNR)

## Quantum Optics: simulation

Bosonic mode are characterized by ladder operators  $a_i, a_i^\dagger$

or, alternatively, with  $\hat{x}_i = \frac{a_i^\dagger + a_i}{2}$  and  $\hat{p}_i = i \frac{a_i^\dagger - a_i}{2}$

For a n-mode system, we have  $\mathbf{q} = (\hat{x}_1, \hat{p}_1, \dots, \hat{x}_n, \hat{p}_n)$

Gaussian state can be represented using  $2n^2+3$  real parameters:

2n displacement vector

$$\mu$$
$$\mu_i = \langle q_i \rangle$$

2nx2n covariance matrix

$$\Sigma$$
$$\Sigma_{ij} = \frac{1}{2} \langle q_i q_j + q_j q_i \rangle$$

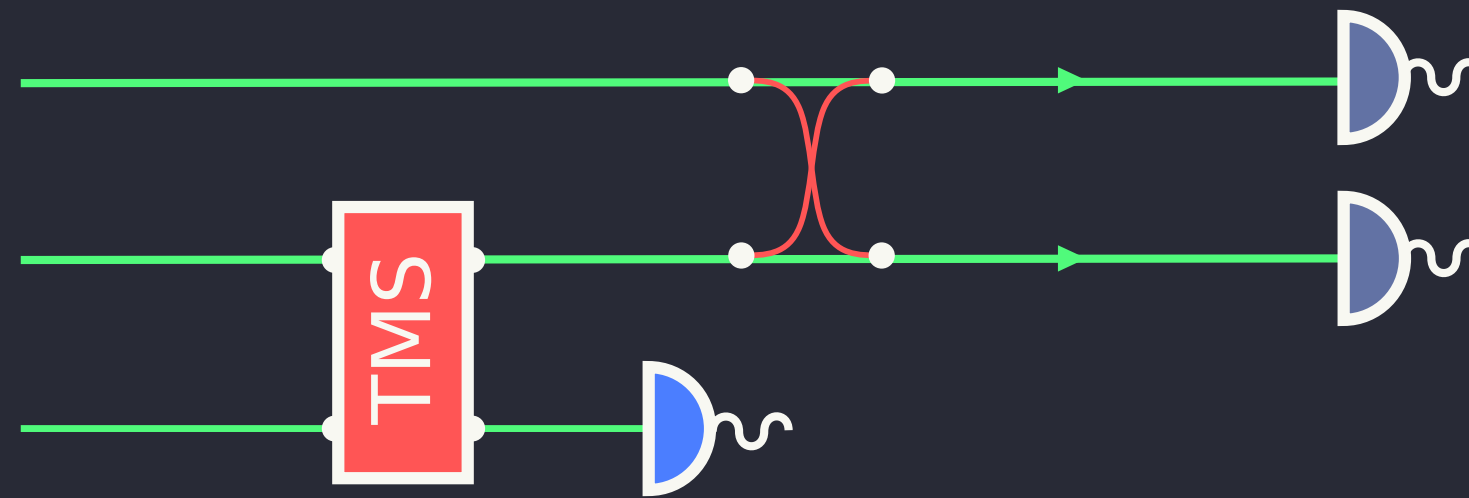
Gaussian operations acts following  $T : (\mu, \Sigma) \rightarrow (M\mu + \vec{d}, M\Sigma M^T)$

Heralding operation are non-Gaussian but the resulting (conditionned) state is a **sum of Gaussian state**

# QuantumOpticalCircuits.jl

Julia pkg to simulate Gaussian optics , heralding , and photondetection

Available on [github.com/xvalcarce/QuantumOpticalCircuits.jl](https://github.com/xvalcarce/QuantumOpticalCircuits.jl)

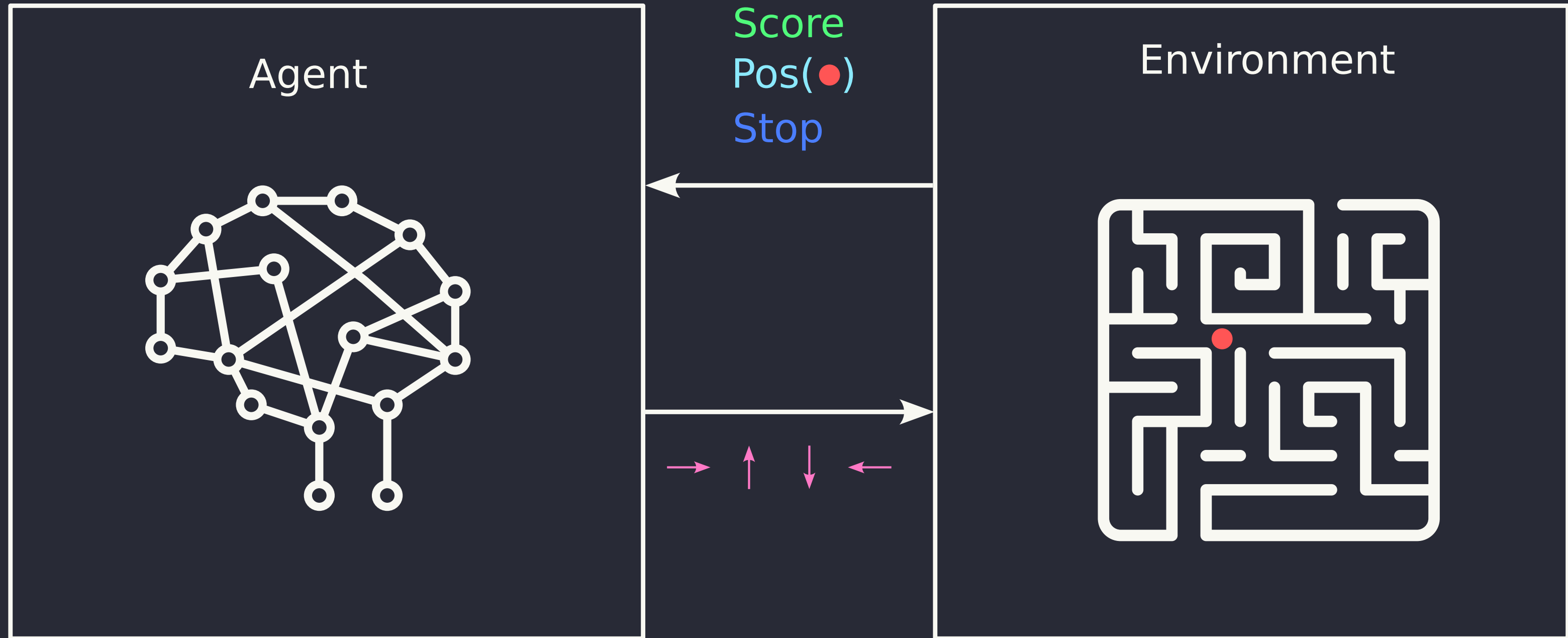


```

julia> using QuantumOpticalCircuits
julia> state = PseudoGaussianState(3);
julia> state = state |> TMS(0.01)(2,3) |> Heralding(3) |> BS( $\pi/4$ )(1,2);
julia> p_click_1 = state |> PhotonDetector(1, $\eta=0.8$ )
0.4000239998415148
julia> p_click_2 = state |> PhotonDetector(2, $\eta=0.8$ )
0.4000239998415148
```

# Reinforcement Learning


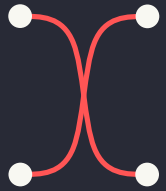




Reinforcement Learning aims at learning a task (game) by trial-and-error





# Reinforcement Learning for photonic DIQKD

Environment: n-mode Optical Circuits

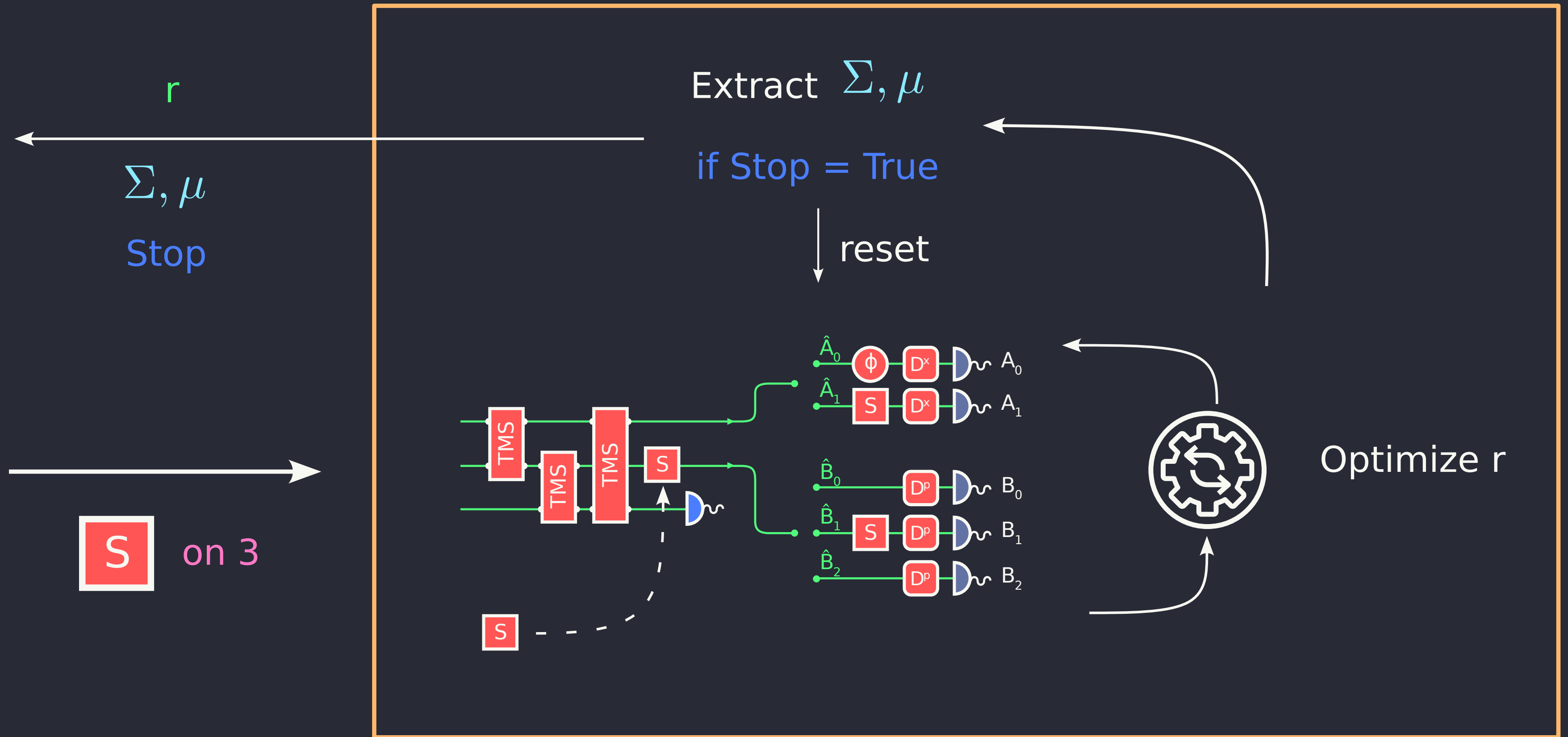
Actions:       acting on mode  $i$  (or  $i,j$ )

Score:  $r = H(\text{key} | \text{NSA}) - H(\text{key} | B)$

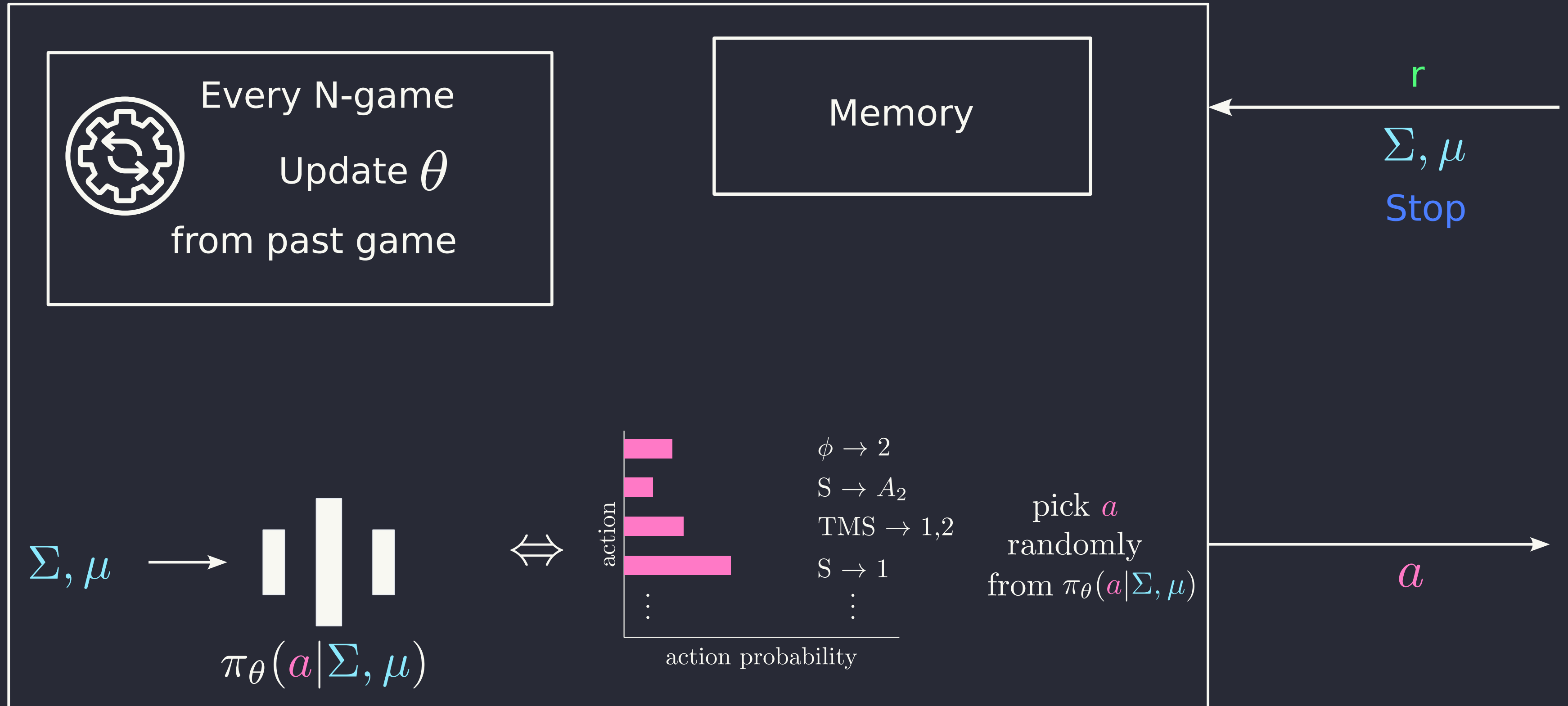
Stop: Maximum # gate reached ||  $r = 1$

State: Gaussian state, i.e.  $\Sigma, \mu$

# Reinforcement Learning for photonic DIQKD

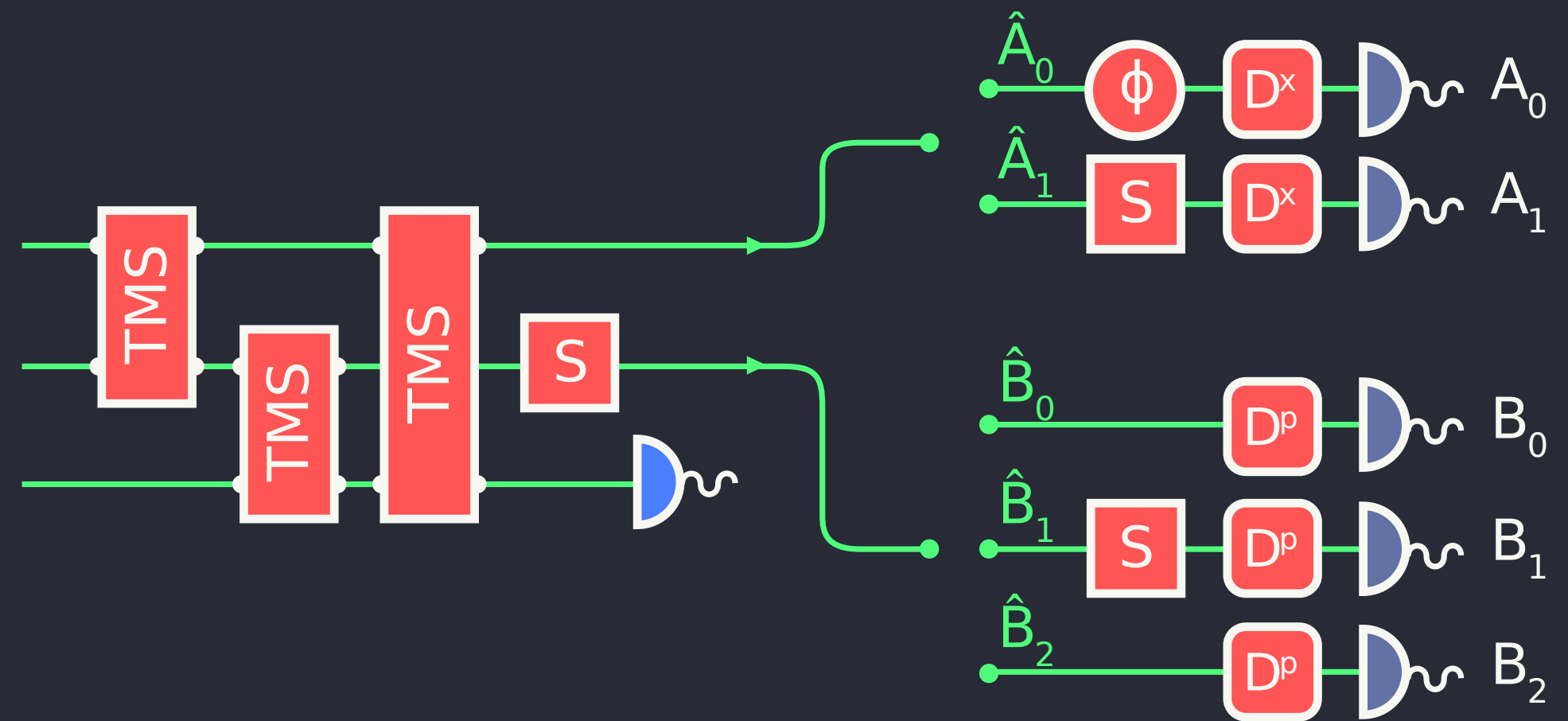


# Reinforcement Learning for photonic DIQKD

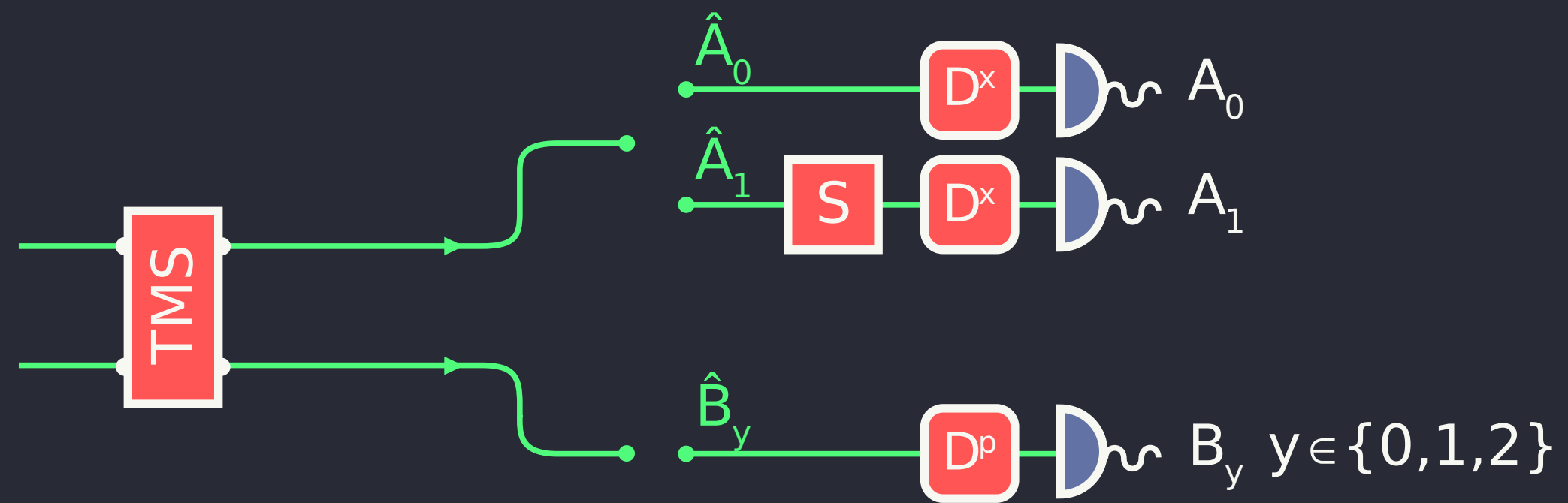


# RL for photonic DIQKD, found circuits

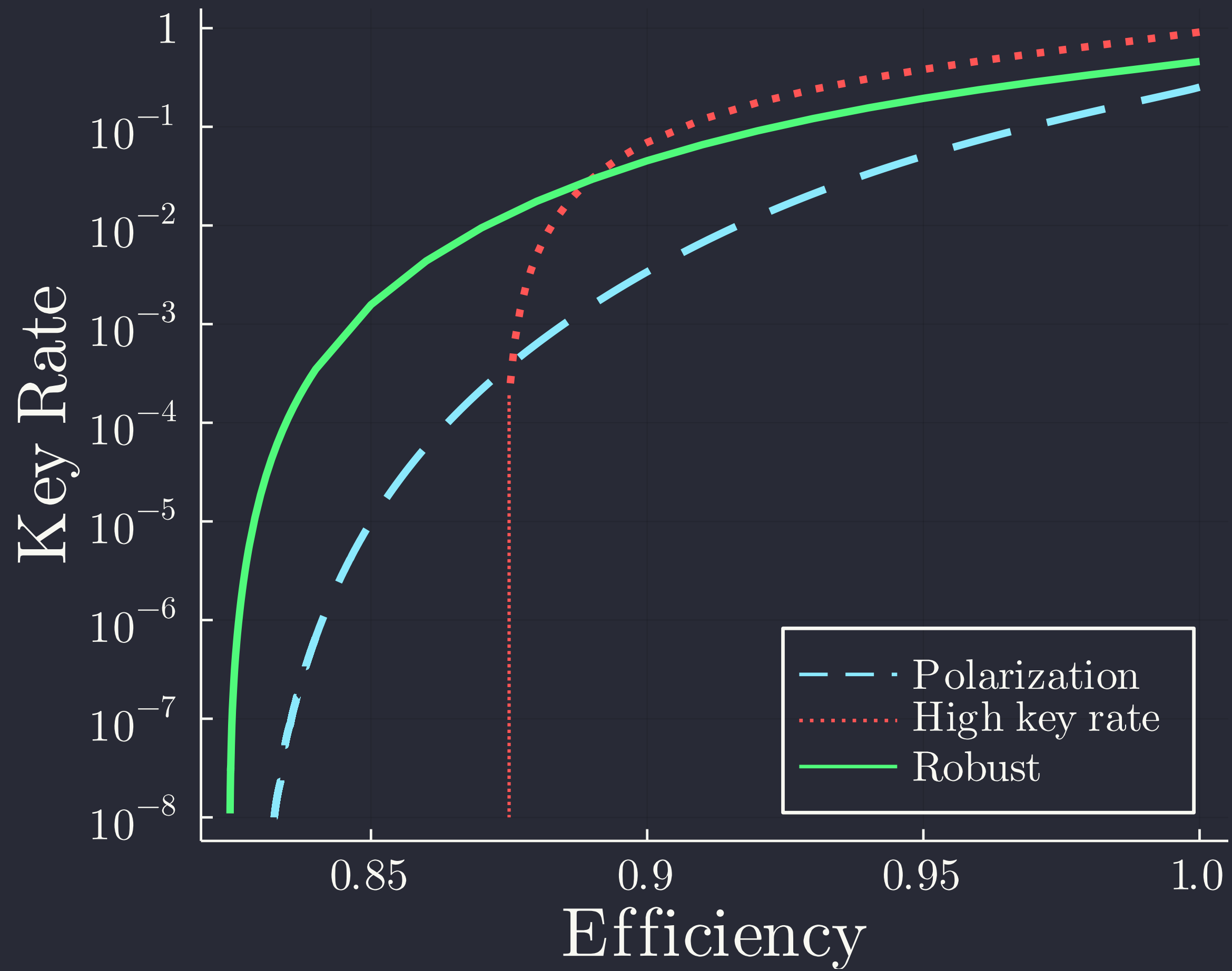
Maximize  $r$  in a ideal scenario



Maximize loss such that  $r > 10^{-4}$



# Reinforcement Learning for photonic DIQKD





## Takeaways

**Device-independent Quantum Key Distribution** allow to share a key between two parties without assumption on the quantum devices used



**Quantum optics** limited to Gaussian operation and heralding can be simulated efficiently (QuantumOpticalCircuits.jl)



**Reinforcement learning** aims at learning a task by interacting with an environment



We used Reinforcement Learning to design quantum optical circuit allowing to implement device-independent quantum key distribution

Thanks for your attention

