



APPLIED QUANTUM MECHANICS GROUP



UNIVERSITÀ DEGLI STUDI DI MILANO  
DIPARTIMENTO DI FISICA

# ULTIMATE PRECISION:

## DEVELOPMENTS IN QUANTUM ESTIMATION THEORY

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**SUPERVISOR: MATTEO G. A. PARIS**

FIRST YEAR PHD STUDENT WORKSHOP

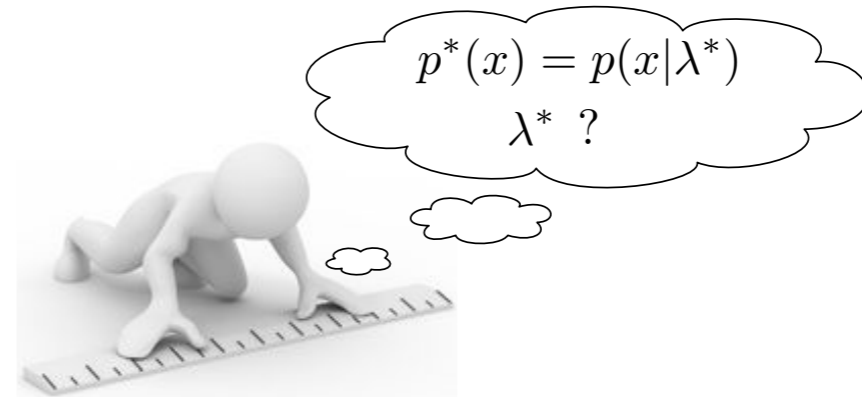
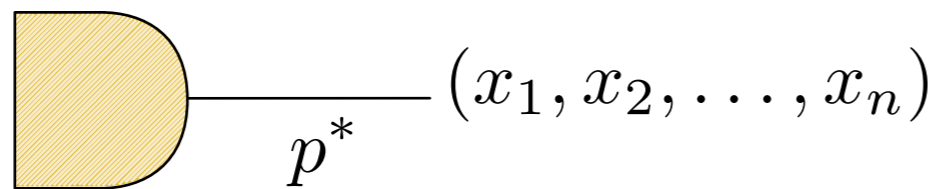
20 OCTOBER 2016

# IN THIS TALK:

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- ▶ Intro to Parameter Estimation Theory
  - ▶ classical estimation problem
  - ▶ quantum estimation problem
- ▶ Ultimate Precision Limits
  - ▶ Cramer - Rao theorems
- ▶ My Work
  - ▶ beyond the quantum Cramer - Rao

# CLASSICAL PARAMETER ESTIMATION



- ▶ an experimentalist has to gain knowledge on an information source by observations
- ▶ the information source is a *probability distribution*
- ▶ the experimentalist assumes the true probability distribution lives inside a *parametric model*

**CLASSICAL ESTIMATION PROBLEM :**

**INFER THE VALUE OF THE PARAMETER WHICH BETTER AGREES WITH THE OBSERVATIONS**

$$X \text{ --- } \mathbb{P}(X = x) = p^*(x) \quad (x_1, x_2, \dots, x_n) \in \mathcal{X}^n$$

$p(x|\lambda)$  with  $\lambda \in \Lambda$  and  $p^*(x) = p(x|\lambda^*)$  statistical model

$X$  random variable

$p^*(x)$

true probability density

$\mathcal{X}$  sample space

$\Lambda$

parameter space

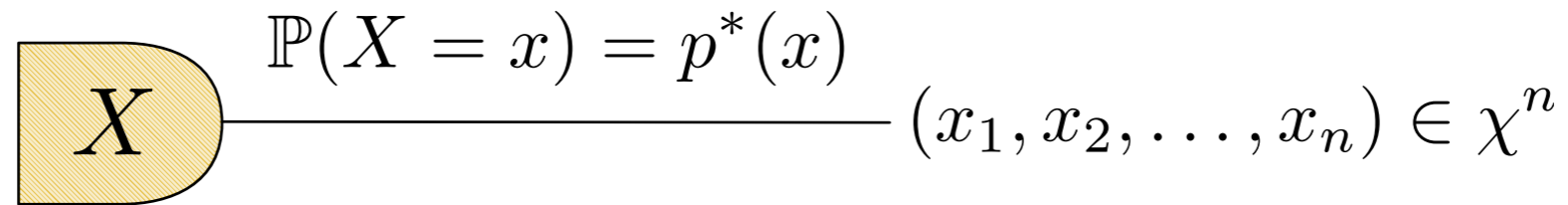
**CLASSICAL ESTIMATION PROBLEM:**

estimator

$$\hat{\lambda} : \mathcal{X}^n \rightarrow \Lambda \quad \text{s.t.} \quad \begin{aligned} \mathbb{E}(\hat{\lambda}) &= \lambda^* \\ \text{Var}(\hat{\lambda}) &= \text{a minimum} \end{aligned}$$

unbiased

efficient



$p(x|\lambda)$  with  $\lambda \in \Lambda$  and  $p^*(x) = p(x|\lambda^*)$  statistical model

$X$  random variable

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true probability density

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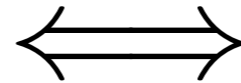
parameter space

**CLASSICAL ESTIMATION PROBLEM:**

- ▶ does an unbiased, efficient estimator exist?
- ▶ what is its variance? best achievable precision

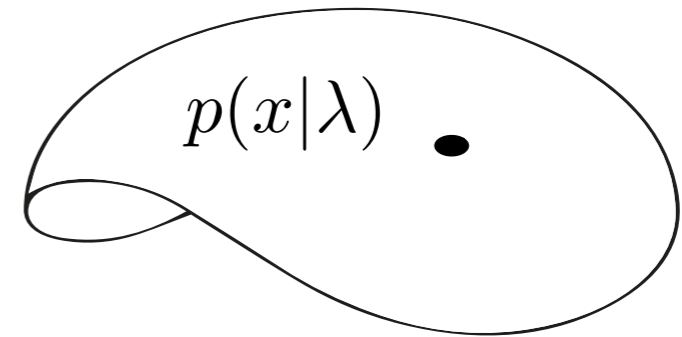
# THE GEOMETRIC PICTURE

parametric model

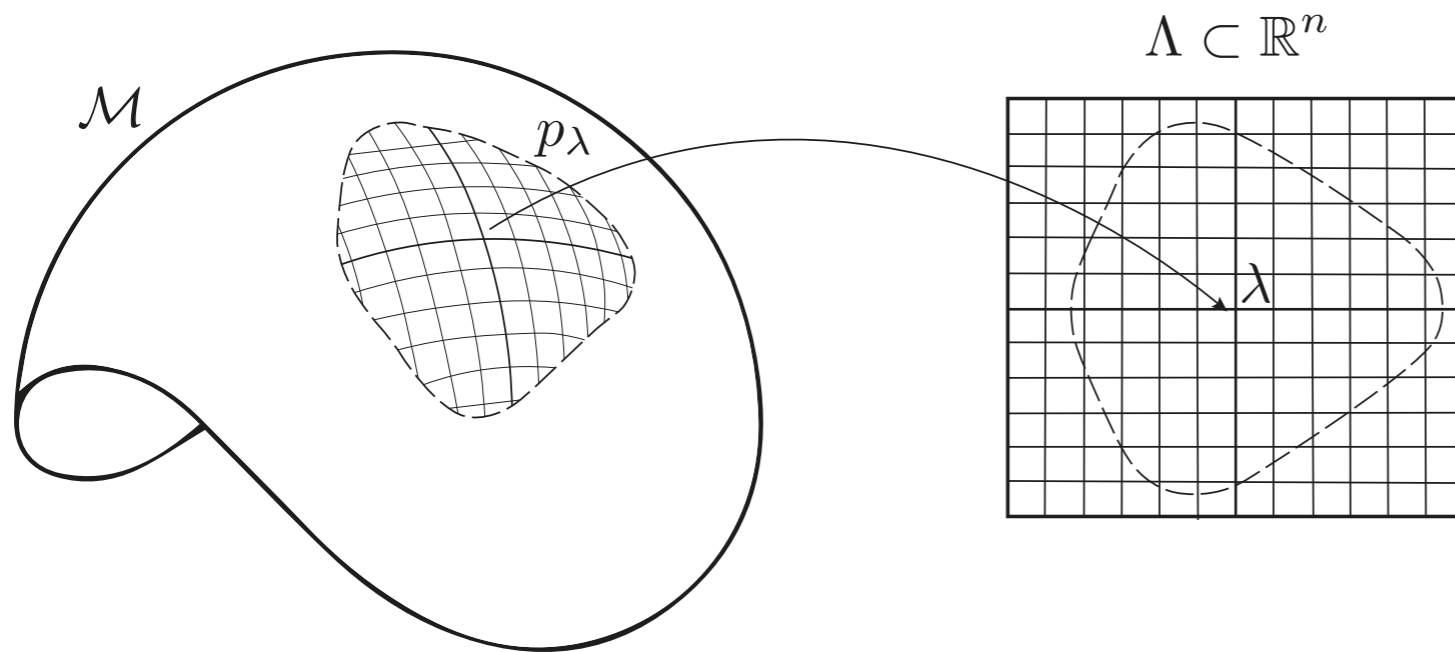


statistical manifold

$$\{ p(x|\lambda), \lambda \in \Lambda \}$$



- ▶ each point is a probability density function
- ▶ Kullback - Leibler divergence measures  $D_{KL}(q||p)$  difference between points
- ▶ Fisher Information metric  $F_{ij}^{(X)}(\lambda)$  provides a natural way to measure lengths and angles



The parametrization  $\lambda \rightarrow p(x|\lambda)$  provides *coordinate charts* on the manifold

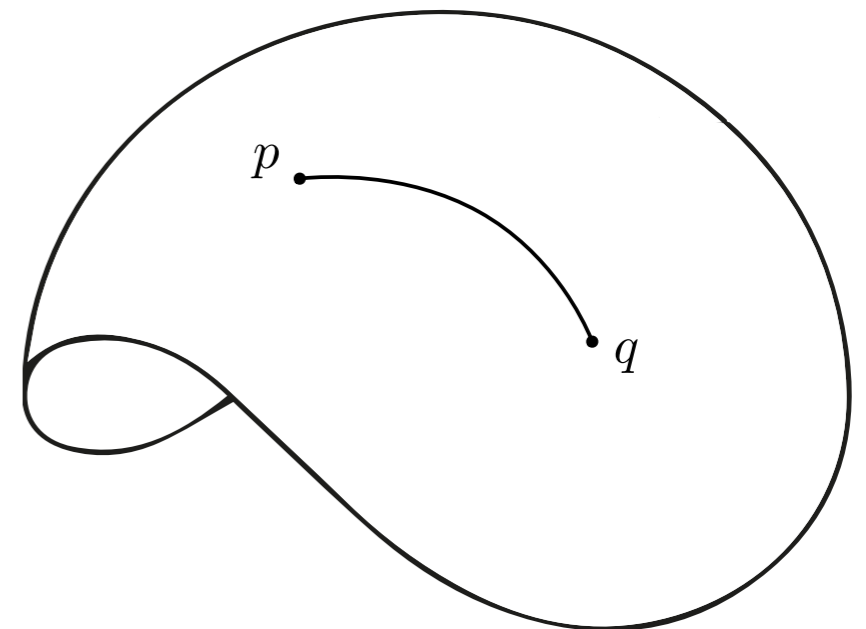
K-L divergence is a *premetric*:

- ▶ nonnegative
- ▶  $D_{KL}(p||q) = 0 \iff p = q$

but:

- ▶ asymmetric
- ▶ violates triangle-inequality

$$D_{KL}(p||q) = \int dx p(x) \log \frac{p(x)}{q(x)}$$



$$\partial_{\lambda} D_{KL}(p(x|\lambda) || p(x|\lambda^*)) |_{\lambda=\lambda^*} = 0$$

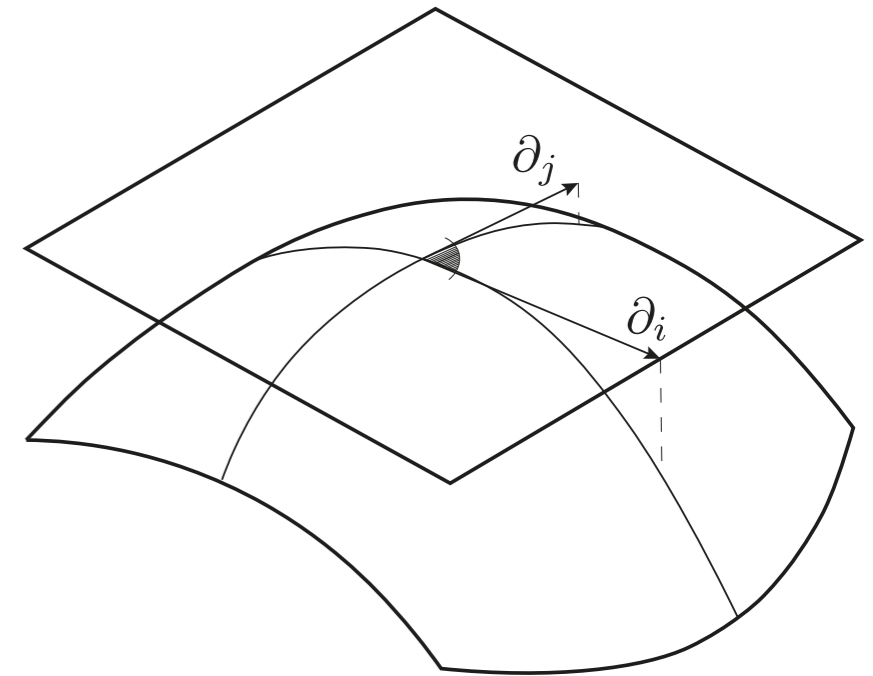


$$D_{KL}(p(x|\lambda) || p(x|\lambda^*)) = 0 + 0 \cdot \lambda + \frac{1}{2} F_{ij}(\lambda^*) \lambda_i \lambda_j$$

## FISHER INFORMATION METRIC

$$\begin{aligned} F_{ij}^{(X)}(\lambda^*) &= \partial_i \partial_j D_{KL}(p(x|\lambda) || p(x|\lambda^*)) |_{\lambda=\lambda^*} \\ &= \int dx p(x|\lambda^*) \partial_i \log p(x|\lambda^*) \partial_j \log p(x|\lambda^*) \end{aligned}$$

$F_{ij}^{(X)}(\lambda)$  defines a *Riemannian metric* on  $\mathcal{M}$





# QUANTUM PARAMETER ESTIMATION

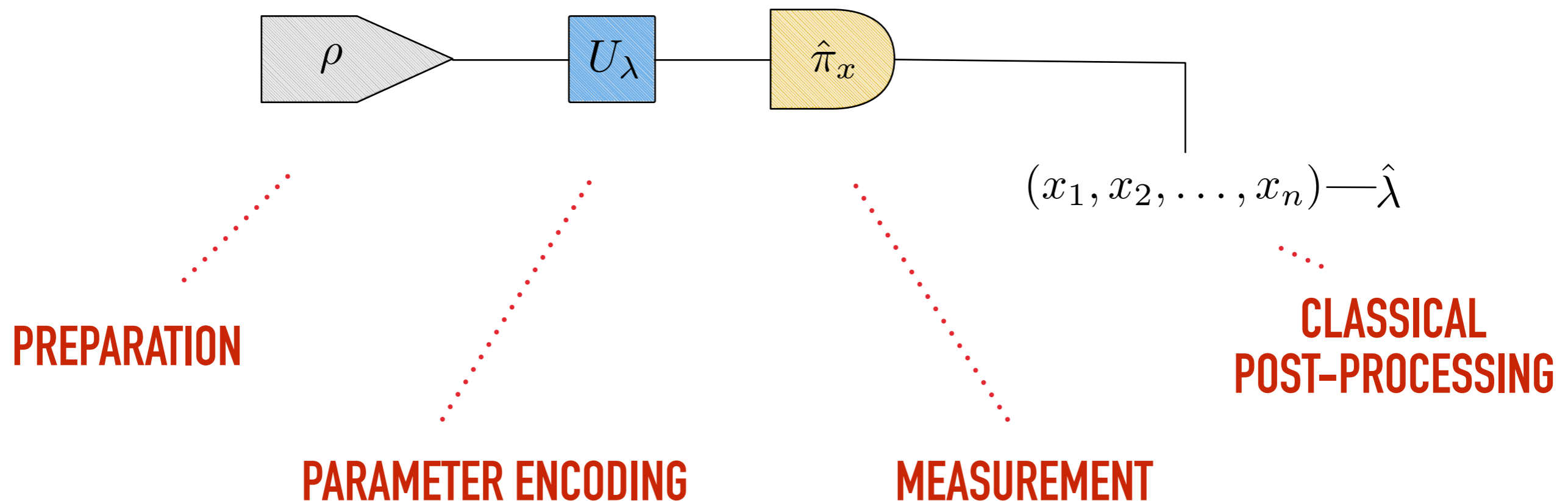
- ▶ a quantum system is represented by a *density operator*  $\rho$
- ▶ an observable  $X$  is represented by a *Hermitian operator*  $\hat{X} = \sum x \hat{\pi}_x$   
so that  $\mathbb{P}(X = x) = \text{tr}(\rho \hat{\pi}_x)$

## BUT HOW TO LEARN THE VALUE OF A NON-OBSERVABLE $\lambda$ ?

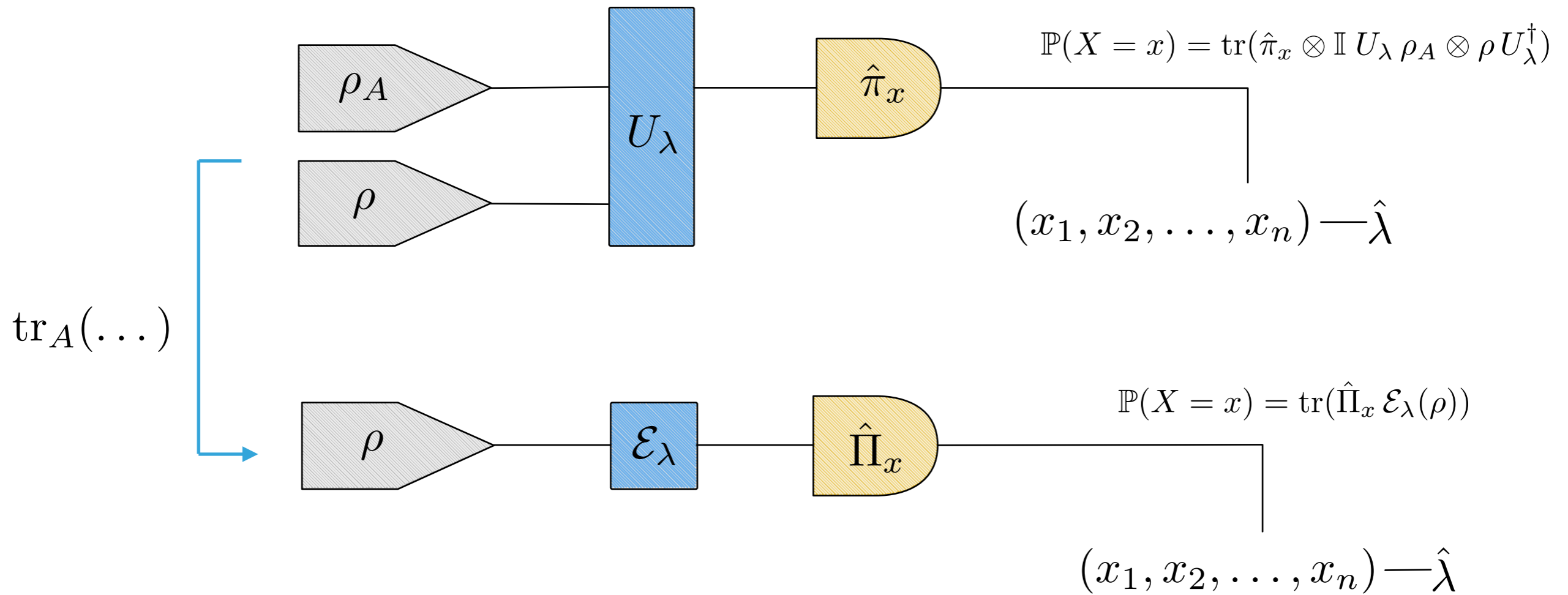
- ▶ many quantities of interest for quantum technologies do not correspond to an observable in the traditional sense:
  - ▶ a unitary phase (e.g. Mach-Zender interferometry)  $\rho \rightarrow e^{-i\lambda \hat{G}} \rho e^{i\lambda \hat{G}}$
  - ▶ a Hamiltonian parameter (e.g. a coupling constant)  $\rho \rightarrow e^{-i\hat{H}(\lambda)t} \rho e^{i\hat{H}(\lambda)t}$
  - ▶ a thermodynamical state parameter (e.g. temperature)  $\rho = \frac{e^{-\lambda \hat{H}}}{Z}$
- ▶ in all these cases one ends up with a *parametric* family of density operators

in QM one is limited to measure *observables*. But, chosen a specific observable  $\hat{X}$  to measure, the probability distribution of the outcomes depends parametrically on  $\lambda$ . One thus is reduced to solving a *classical estimation problem*.

**DIRECT MEASUREMENT**



INDIRECT MEASUREMENT



quantum map

measurement operators

$$\mathcal{E}_\lambda(\rho) = \sum_x \hat{M}_x \rho \hat{M}_x^\dagger$$

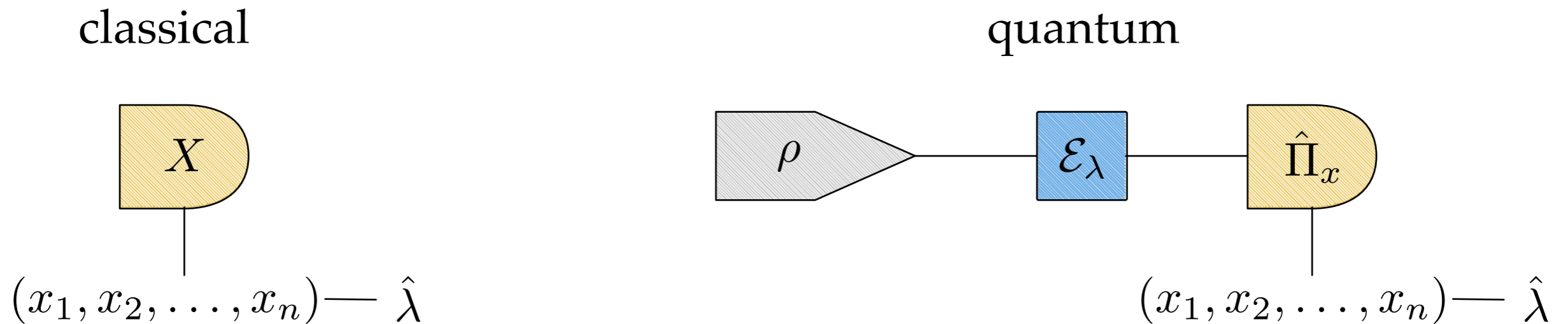
$$\sum_x \hat{\Pi}_x = \mathbb{I}, \quad \hat{\Pi}_x > 0$$

POVM

$$\hat{\Pi}_x = \hat{M}_x^\dagger \hat{M}_x$$

$$\hat{\Pi}_x^\dagger = \hat{\Pi}_x \text{ but } \hat{\Pi}_x \hat{\Pi}_y \neq \hat{\Pi}_x \delta_{xy}$$

# CRAMER – RAO THEOREMS



Achieving the *ultimate precision* requires minimization of  $\text{Var}(\hat{\lambda})$ :

- ▶ choice of the quantum measurement scheme
- ▶ choice of the classical estimator

easy, old problem in classical statistics

hard, fundamental problem of quantum metrology

- ▶ choice of the classical estimator

## CLASSICAL CRAMER - RAO THEOREM

GEOMETRY



STATISTICS

$$\text{Var}(\hat{\lambda}) \geq \frac{1}{F(\lambda)},$$

moreover the bound can always be saturated, at least asymptotically

- ▶ choice of the quantum measurement scheme
  - ▶ maximize the Fisher Information over the set of all possible POVMs
  - ▶ the Fisher Information of the optimal measurement scheme is the ultimate precision allowed by QM

$$\max_{\{\Pi_x\}} F^{(X)}(\lambda) = ?$$

## QUANTUM CRAMER – RAO THEOREM

S. L. Braunstein, C. M. Caves, Phys. Rev. Lett. 72, 3439 (1994)

Quantum Fisher Information

$$F^{(X)}(\lambda) \leq J(\lambda),$$

moreover the bound can always be saturated by a projective measurement of  $L_\lambda$

$$J(\lambda) = \text{tr}(\mathcal{E}_\lambda(\rho)L_\lambda^2)$$

$$\partial_\lambda \mathcal{E}_\lambda(\rho) = \frac{1}{2} \{\mathcal{E}_\lambda(\rho), L_\lambda\}$$

symmetric logarithmic derivative

$J(\lambda)$ :

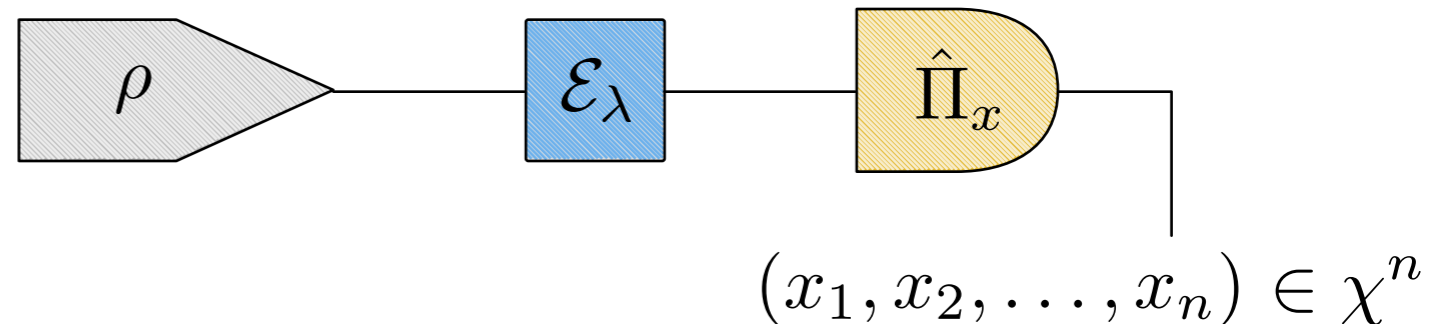
- ▶ quantifies the ultimate limits to precision allowed by QM
- ▶ defines a Riemannian metric on the manifold of quantum states
- ▶ is fundamental for the design and characterization of systems operating at the quantum scale

generalized uncertainty relations

quantum metrology,  
quantum sensing...

# BEYOND THE QUANTUM CRAMER – RAO

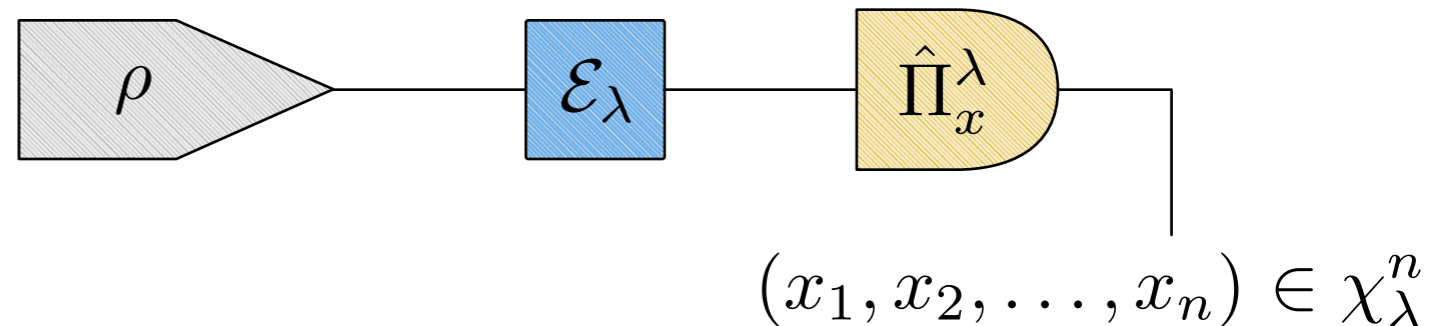
the unknown parameter influences neither the sample space of outcomes nor the measurement aimed at extracting information on the parameter itself



- ▶ this assumption is *crucial* to introduce the quantum Fisher information as an upper bound to the Fisher information of any possible measurement
- ▶ however, there are relevant estimation problems where the assumption does not hold
- ▶ genuine ultimate bound to precision of quantum measurements?

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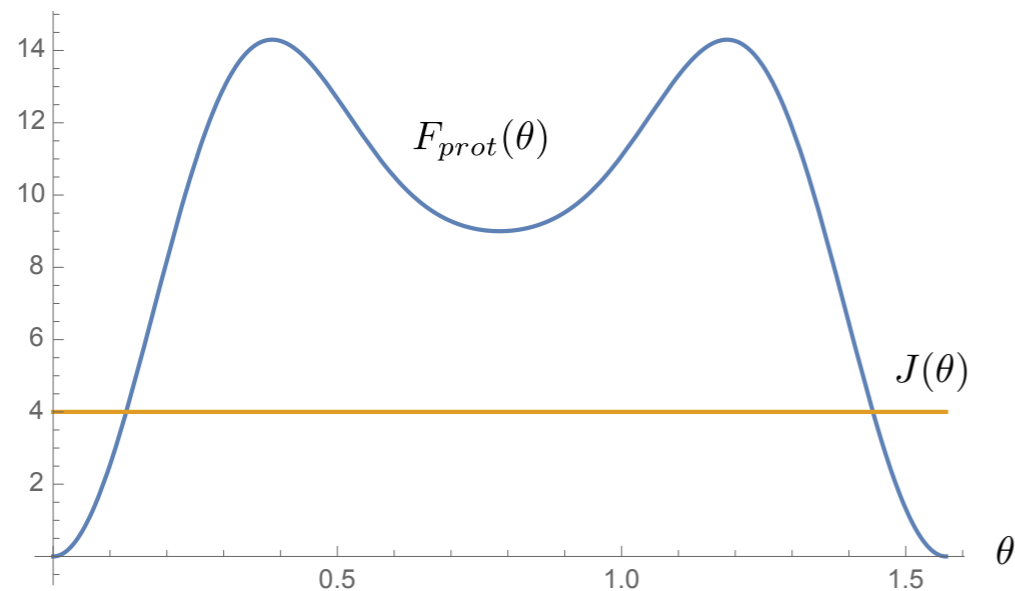
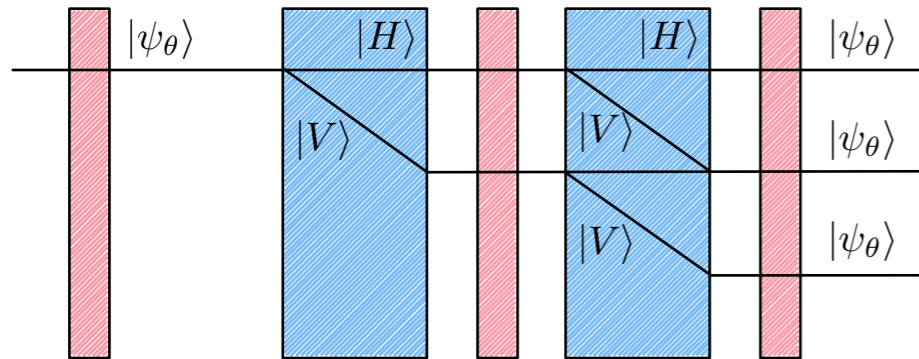


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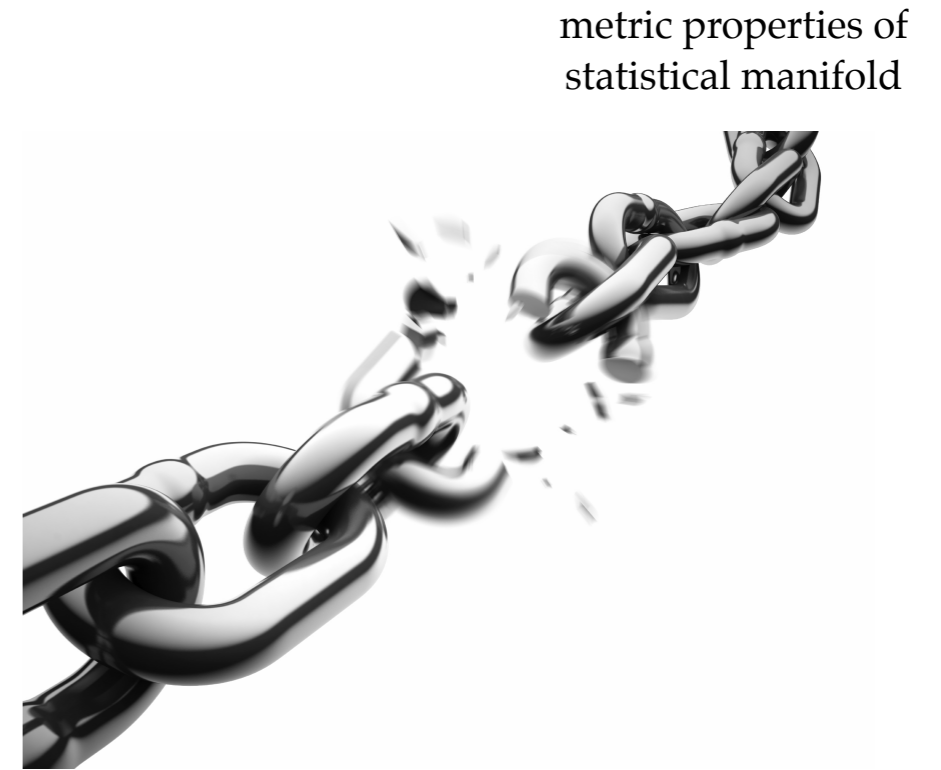
## THE GOOD

measurement strategies that depend on the unknown parameter can lead to *better precision*



## THE BAD

the link between geometry and statistics is severed

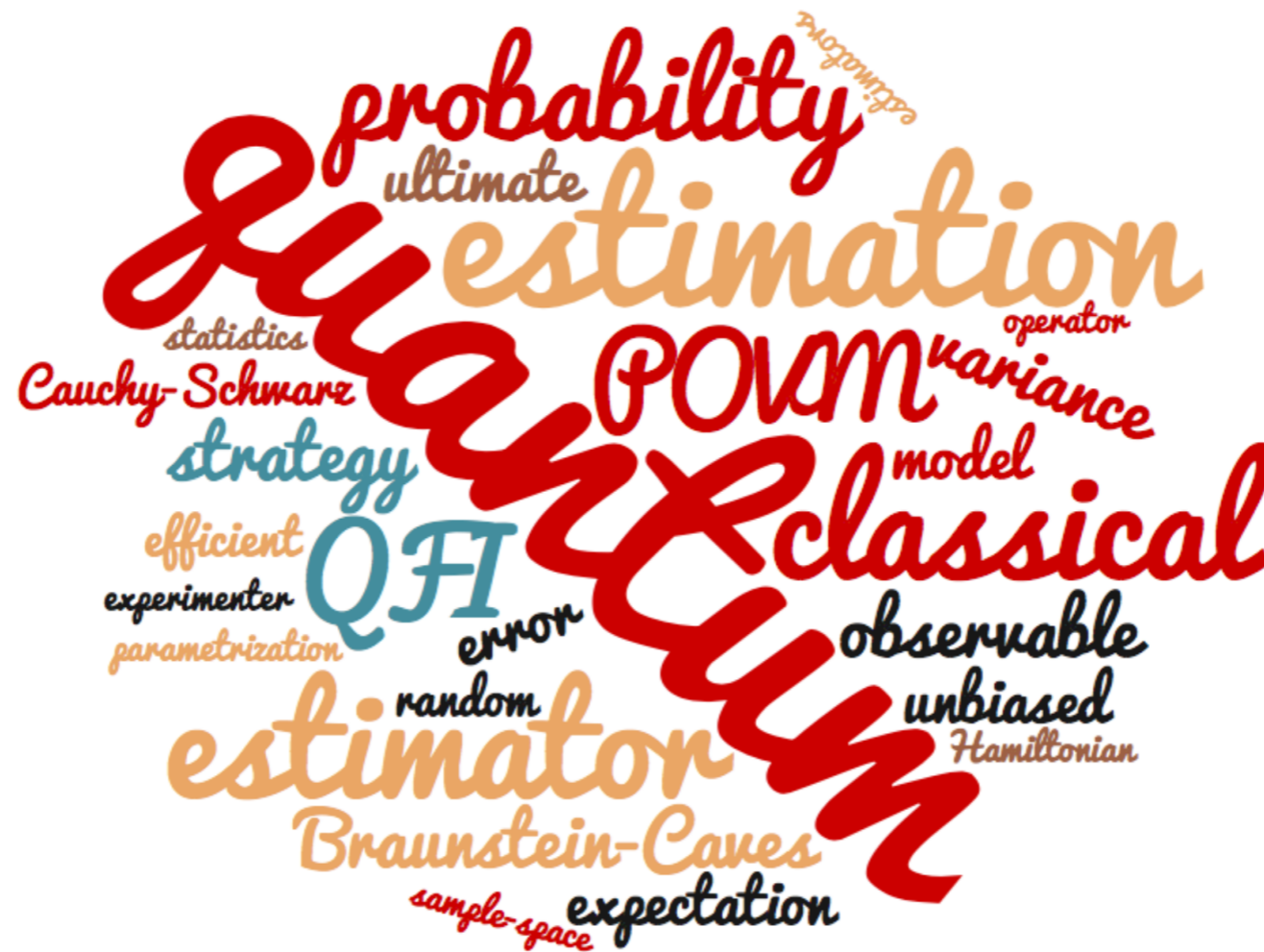


precision limits on the unknown parameter

### TAKE - HOME MESSAGES

- ▶ quantum estimation theory based on the B - C inequality is the basis of quantum technology and has appealing geometric interpretation
- ▶ ... but it only takes into consideration the information on the parameter coming from the manifold of states
- ▶ in fact, B - C inequality is violated when implementing measurement strategies that intrinsically depend on the parameter
  - ▶ new conceptual difference between classical and quantum parameter estimation
  - ▶ quantum measurement can be more precise than previously thought

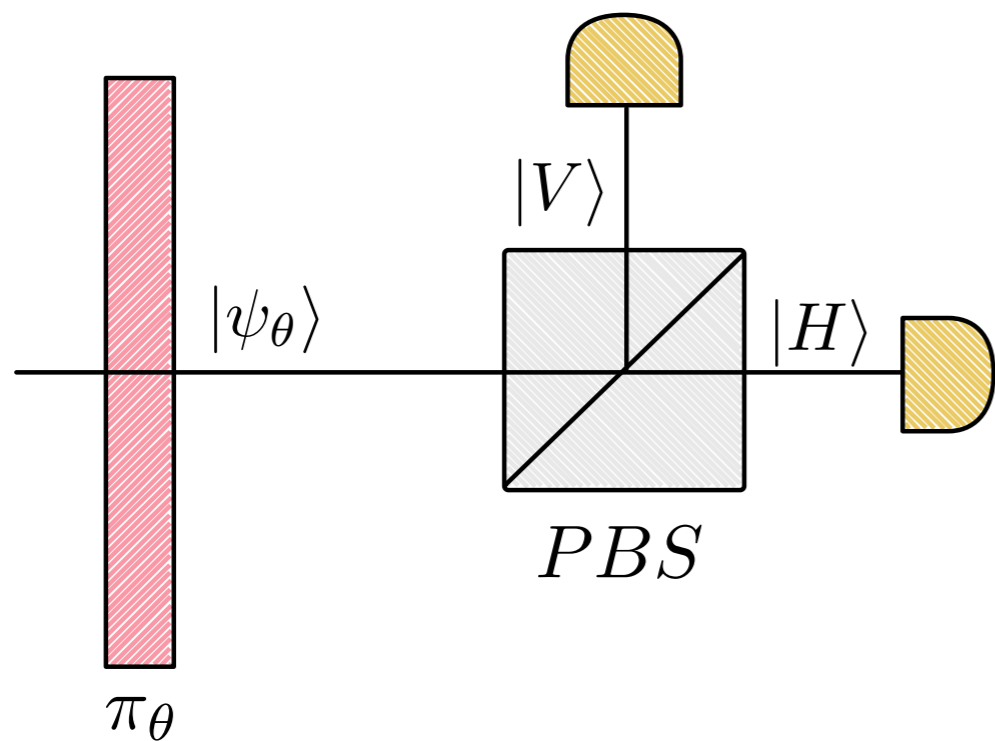
# Thank you!



## PARAMETER - DEPENDENT POVMS CAN ARISE IN MANY WAYS:

- ▶ estimating algebra deformation induced by a minimal length at Planck scale
- ▶ energy measurement in a Hamiltonian parameter estimation problem
- ▶ parameter - dependent interaction Hamiltonian between system and meter
- ▶ parameter characterizing the measurement apparatus

In all these cases, B - C inequality can be violated



**OPTIMAL MEASUREMENT SCHEME  
ACCORDING TO STANDARD QET**

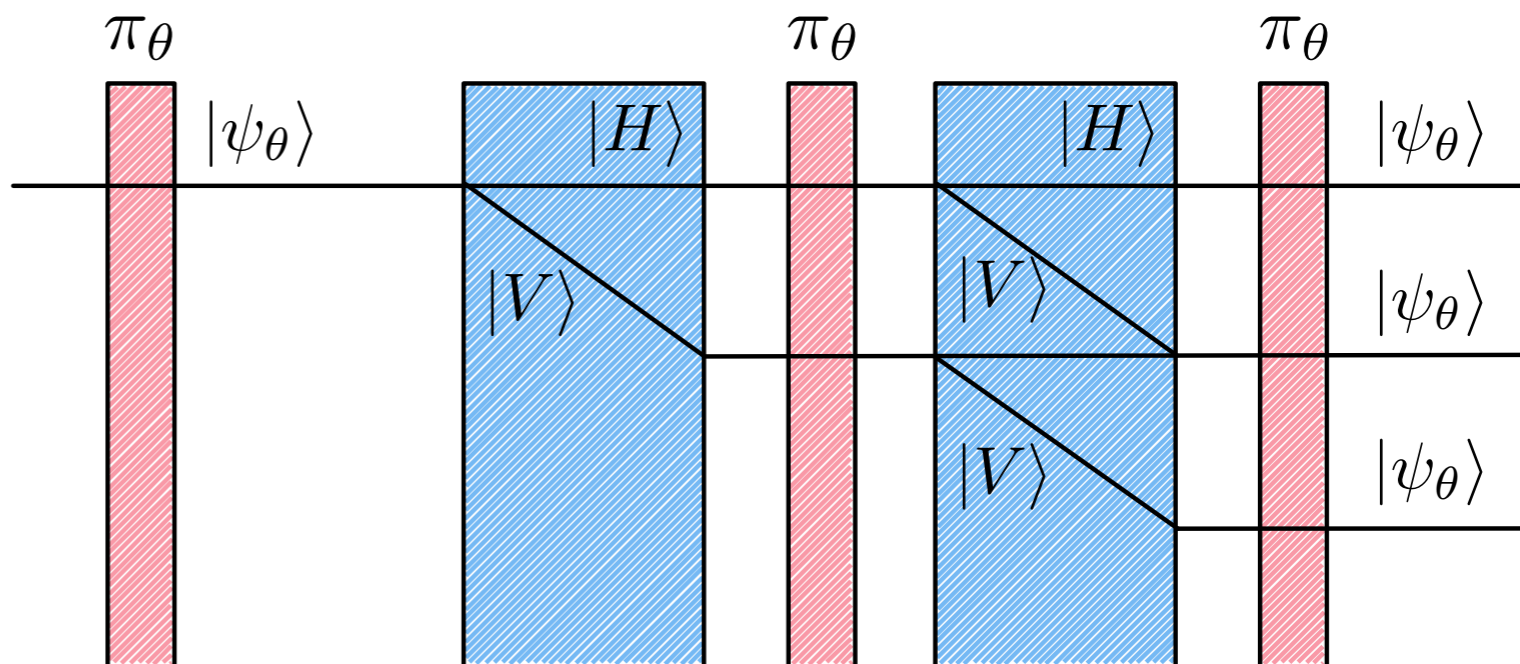
$$F_{PBS}(\theta) = J(\theta) = 4$$

$$|\psi\rangle_{t=0} = |f\rangle \otimes |\psi_\theta\rangle$$

$$|f\rangle = \int dx f(x) |x\rangle$$

$$|\psi_\theta\rangle = \cos \theta |H\rangle + \sin \theta |V\rangle$$

$$U = e^{-igP} \otimes \pi_V$$



# QUANTUM CRAMER - RAO THEOREM CAN BE BEATEN

$$\tilde{F}_{prot}(\theta)/J(\theta)$$

