

Title: Inferring causal structure: a quantum advantage

Date: Jul 17, 2014 03:30 PM

URL: <http://pirsa.org/14070021>

Abstract: A fundamental question in trying to understand the world -- be it classical or quantum -- is why things happen. We seek a causal account of events, and merely noting correlations between them does not provide a satisfactory answer. Classical statistics provides a better alternative: the framework of causal models proved itself a powerful tool for studying causal relations in a range of disciplines. We aim to adapt this formalism to allow for quantum variables and in the process discover a new perspective on how causality is different in the quantum world. Causal inference is a central task in the context of causal models: given observed statistics over a set of variables, one aims to infer how they are causally related. Yet in the seemingly simple case of just two classical variables, this is impossible (unless one makes additional assumptions). I will show how the analogous task for quantum variables can be solved. This quantum advantage is reminiscent of the advantages that quantum mechanics offers in computing and communication, and may lead to similarly rich insights. Our scheme is corroborated by data obtained in collaboration with Kevin Resch's experimental group. Time permitting, I will also address other applications of the quantum causal models. arXiv:1406.5036

# Inferring Causal Structure: a Quantum Advantage

and other applications  
of Quantum Causal Models

**Katja Ried**

Perimeter Institute for Theoretical Physics

Quantum Foundations Seminar, PI

July 17<sup>th</sup> 2014



# Outline

- Introduction
  - models of causality for the quantum world
- The task
  - causal inference, and why it is hard
- Method
  - how quantum conditionals provide an advantage
- Results
  - experimental verification
- Encore
  - causal tomography
- Other projects

# Introduction

## causal models for the quantum world



# Clinical trial of [REDACTED]

## Introduction

Rather than merely observing correlations between events, science seeks to explain these correlations in terms of causal influences. In the context of classical variables, the concept of causation has been rigorously defined, and a framework for describing systems in terms of their causal relations has been established [Pearl\_book, SpirtesEIAI\_book].

## Method

Its applications are manifold; a testament to the fact that a causal model captures the essence of "how the system works". In a sense, it describes how information flows from one event to the other. What would a similar account of the relations between a set of quantum variables look like? I will discuss some ways in which classical causal models must be adapted to accommodate quantum variables, highlighting how causation and information processing are different from the classical case.

## Results

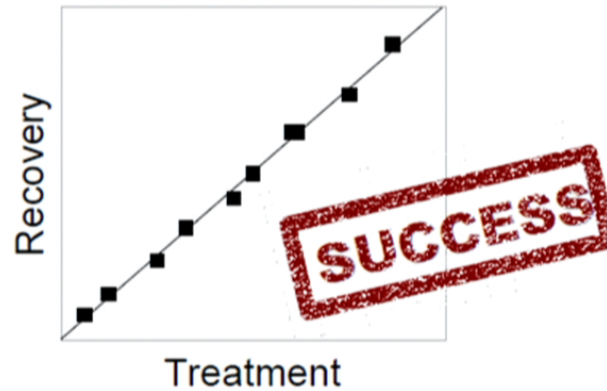


Fig. 1: Recovery correlates with treatment to a statistical significance of 20 standard deviations.

## Conclusion

In particular, one such difference allows us to solve a task that is impossible to solve classically. "Causal Inference" refers to the problem of determining the causal relations between a set of variables, given observational data. In the case of two classical variables, the correlations that can arise if one variable is a direct cause of the other are precisely the same as those that can arise from a common cause acting on both, so it is impossible to deduce the causal structure from them. Yet for quantum variables, we show that the correlations do encode a signature of the causal structure, which allows us to solve the causal inference problem. We illustrate this with data from a proof-of-concept experiment that corroborates our scheme for quantum causal inference [Agnew\_draft].

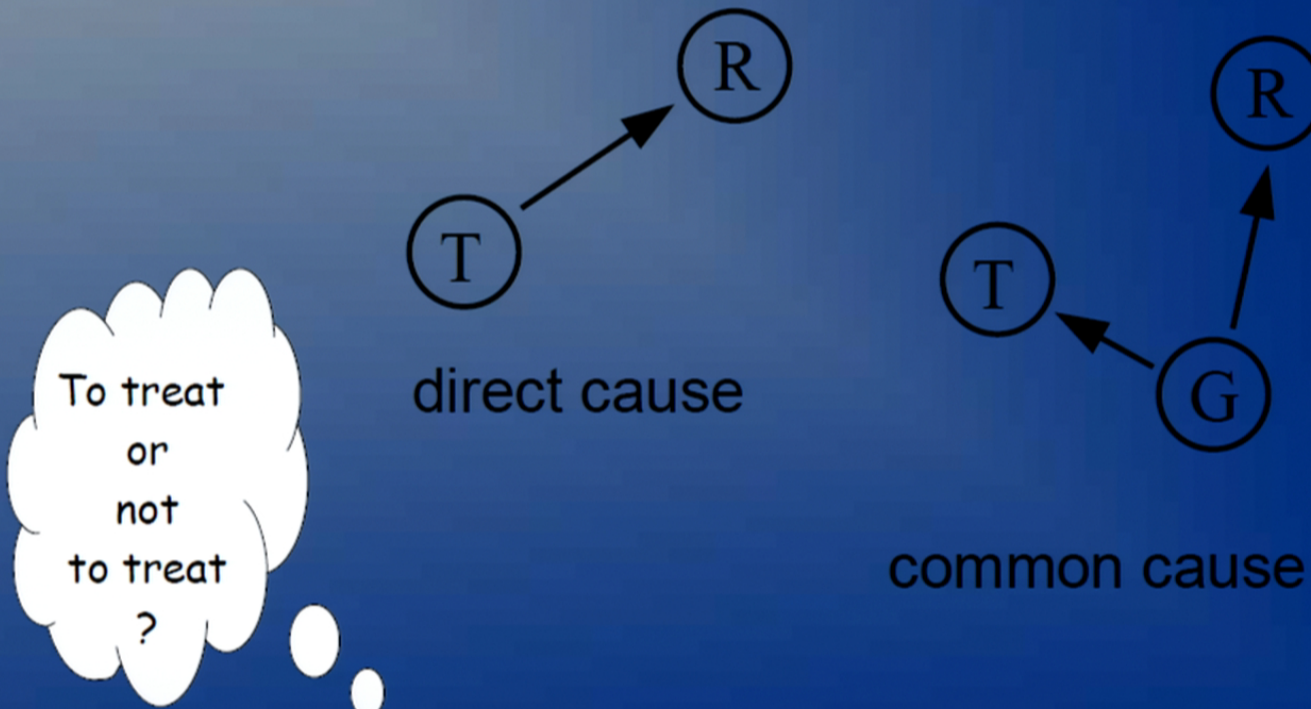
Introduction: classical causal models

- Mostly men take the drug.
- Men recover on their own.
- If someone takes the drug, they are likely to recover (on their own)



Introduction: classical causal models

# More than correlation: Causation



Introduction: classical causal models

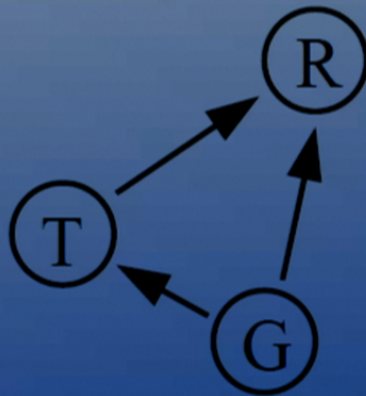


# Classical causal models

over a set of variables describe causal influences:

Structure

who influences whom



directed acyclic graph

+

Parameters

dependence on parents

$$P(R|TG)$$
$$P(T|G)$$
$$P(G)$$

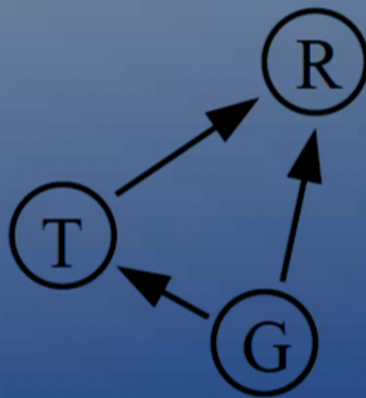
conditional probabilities

Introduction: classical causal models

“Causality – reasoning, models and inference”  
J. Pearl, Cambridge University Press, 2009.

# Quantum causal models

Structure



directed acyclic graph

+

Parameters

?

quantum conditionals

Introduction: quantum causal models



# Quantum conditionals

Defining property: rule of inference

classical

$$P(B) = \sum_a P(B|A) P(A)$$

quantum

$$\rho_B = \text{Tr}_A(\rho_{B|A} \rho_A)$$

Introduction: quantum causal models

# The task:

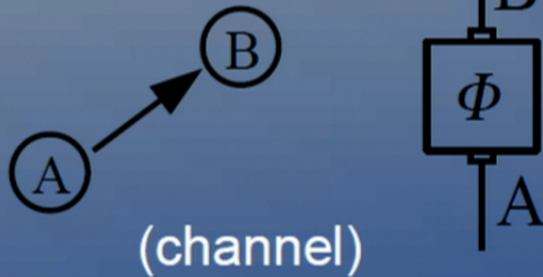
## inferring causal structure



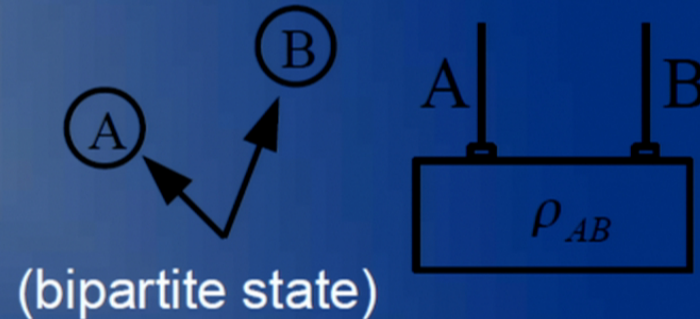
# Inferring causal structure

Given statistics  $P(A,B), \dots$

direct cause...



...or common cause?



Fundamental task across fields of science:  
determine how the system works, so as to control it

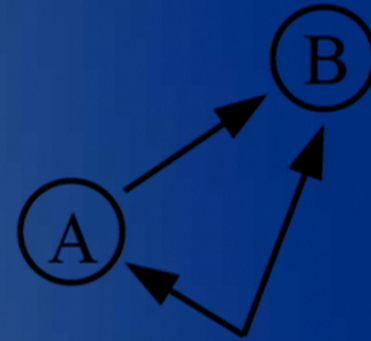
The task: classical causal inference



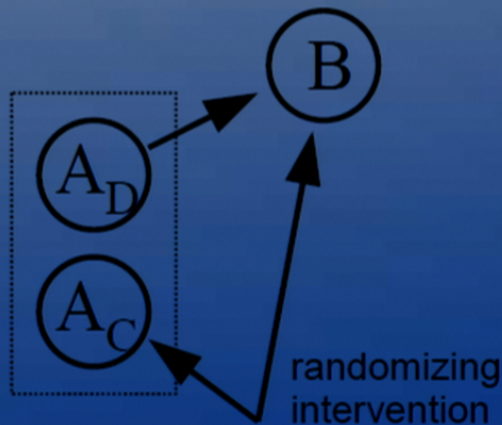
# Observation and intervention

For two classical variables,

- all  $P(A,B)$  are compatible with both causal structures  
⇒ Inference is *impossible*.
- ... but if we *intervene* (measure and reprepare  $A$ ),



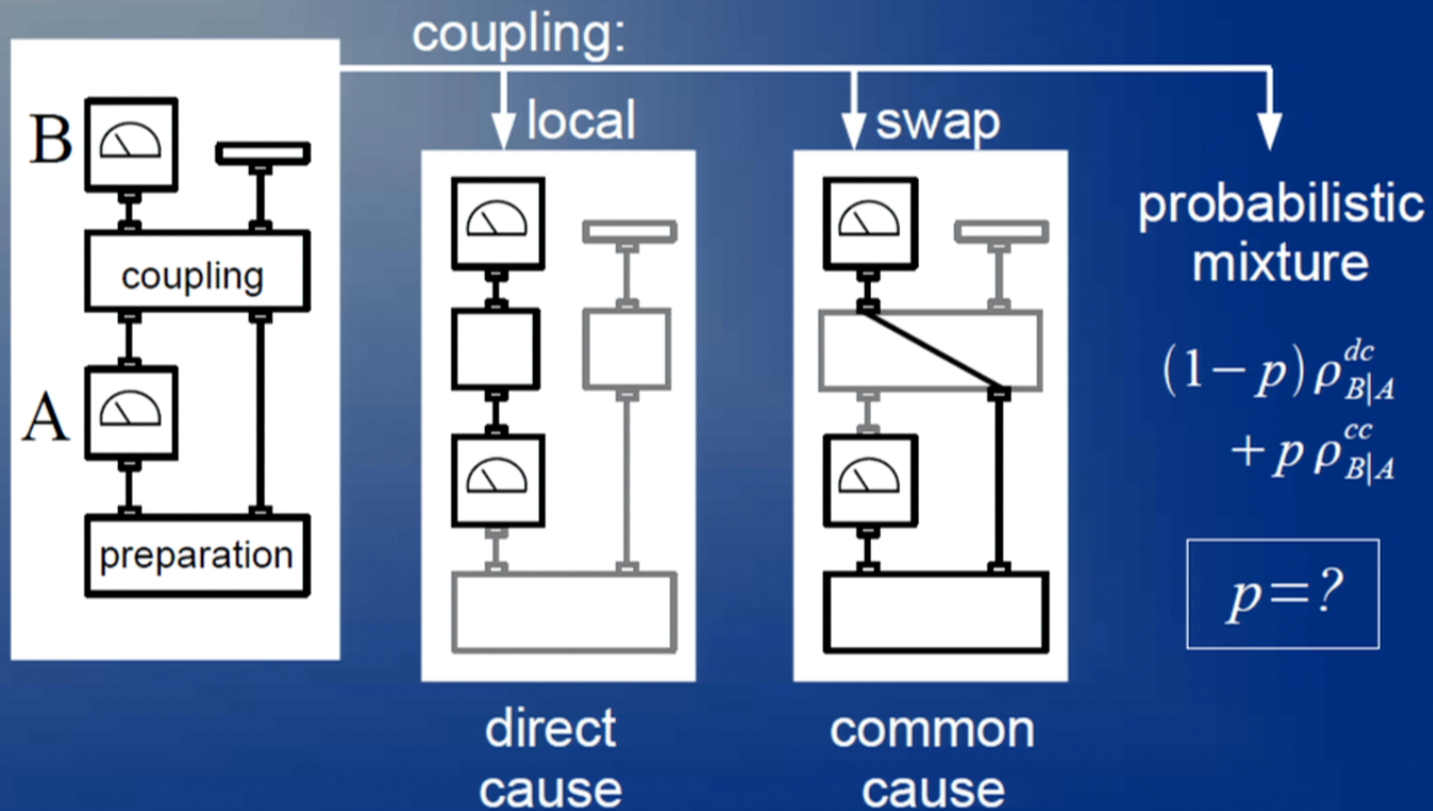
passive observation



- correlation  $B-A_C$  quantifies common-cause influence;
- $B-A_D$  quantifies direct cause.  
⇒ Inference is *trivial*.

The task: classical causal inference

# Two quantum variables with tunable causal relation



The task: quantum causal inference



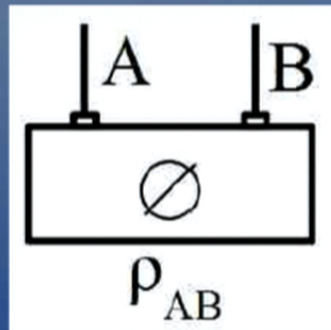
# Method

the quantum advantage

# Peculiarities of quantum conditionals I

Classical  $P(B|A)$  can characterize  
any causal relation, but...

Common-cause quantum conditionals



$$\rho_{B|A} \equiv \rho_A^{-1/2} \rho_{AB} \rho_A^{-1/2}$$

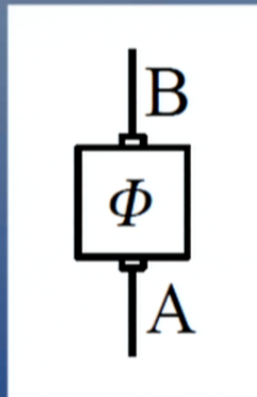
property:  $\rho_{B|A}^{cc} \geq 0$

Method – the quantum advantage M Leifer and RW Spekkens, “Formulating quantum theory as a causally neutral theory of Bayesian inference”, arXiv:1107.5849



# Peculiarities of quantum conditionals I

## Direct-cause quantum conditionals



Choi-Jamiolkowski isomorphism:

$$\rho_B = \Phi(\rho_A) = \text{Tr}_A(\rho_{B|A}^{dc} \rho_A)$$

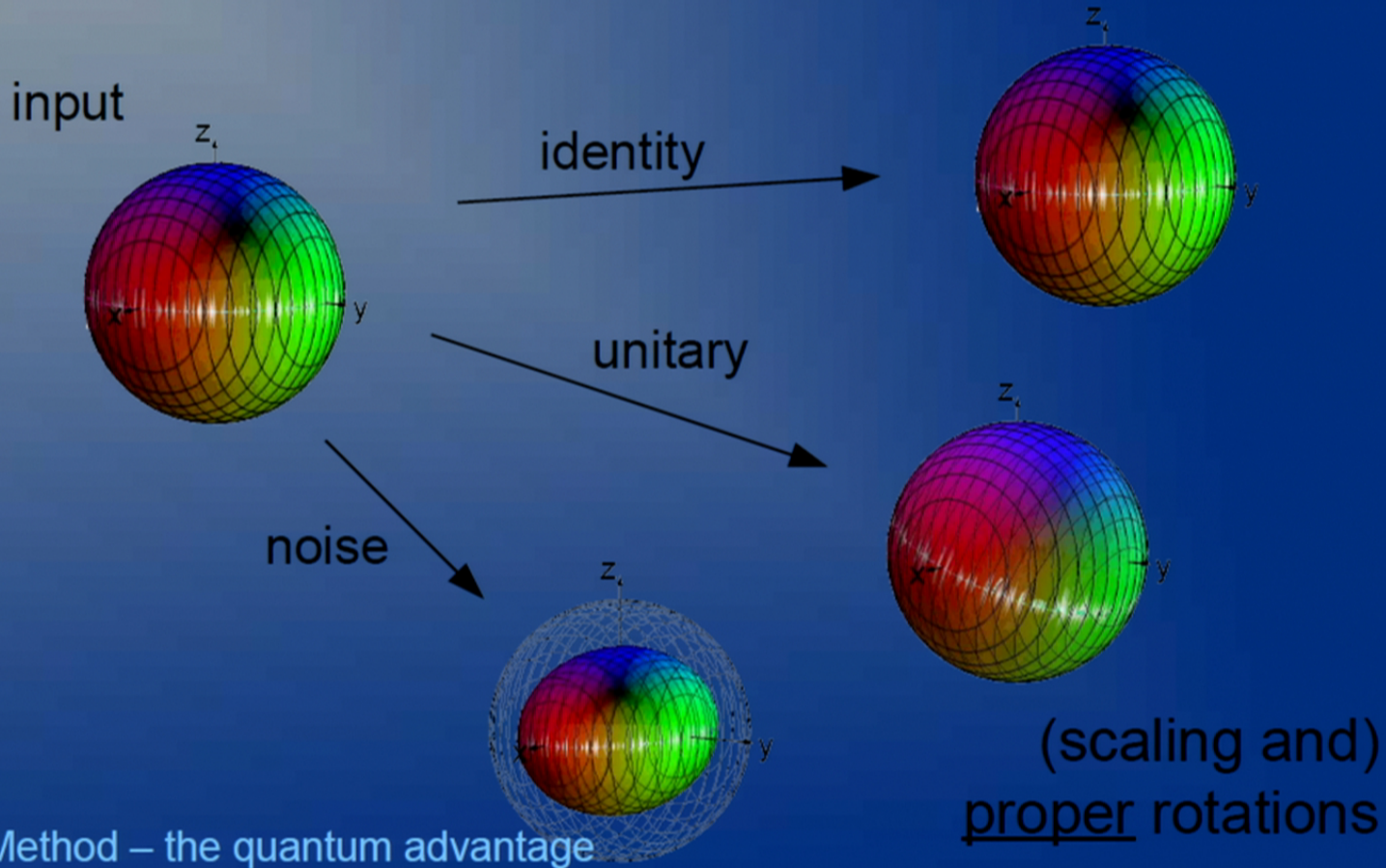
$$\rho_{B|A}^{dc} = \sum_{jk} \Phi(|j\rangle\langle k|) \otimes |k\rangle\langle j|$$

property:  $(\rho_{B|A}^{dc})^{T_A} \geq 0$

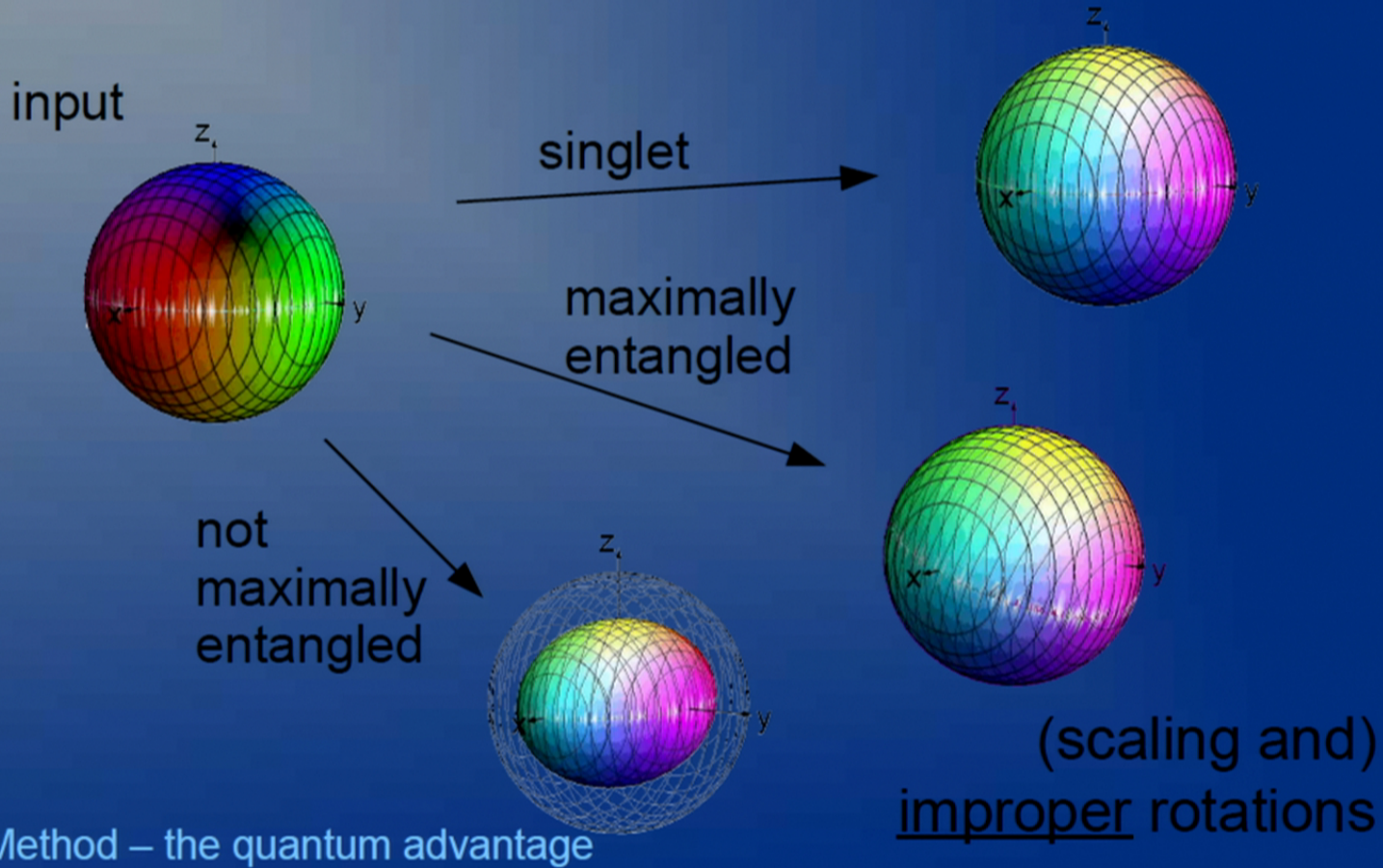
Method – the quantum advantage



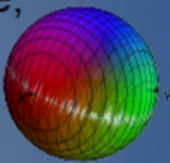
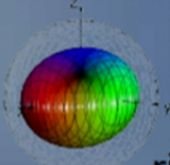
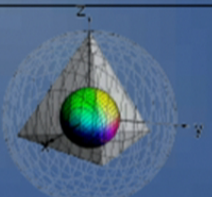
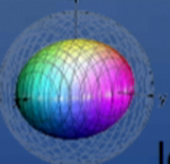
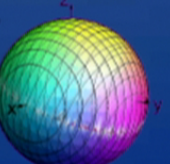
# Images of the Bloch sphere under direct-cause relations (channels)



# Images of the Bloch sphere under common-cause relations (steering)





|                            |  |  |   |  |   |
|----------------------------|--|--|---|--|---|
| direct-cause,<br>noiseless | unit sphere,<br>right-<br>handed         |    | $(\rho_{B A})^{T_A} \geq 0$<br>rank-one | unitary channel  |   |
| direct-cause,<br>noisy     |  |     | ellipsoid,<br>right-handed              | $(\rho_{B A})^{T_A} \geq 0$<br>$\rho_{B A} \not\geq 0$ | non-unitary<br>channel                                |
| undecidable<br>(classical) | ellipsoid<br>inside<br>tetra-<br>hedron* |    |   | $(\rho_{B A})^{T_A} \geq 0$<br>$\rho_{B A} \geq 0$     | entanglement-breaking<br>channel, separable<br>state, |
| common-cause,<br>noisy     |  |     | ellipsoid,<br>left-handed               | $\rho_{B A} \geq 0$<br>$(\rho_{B A})^{T_A} \not\geq 0$ | not maximally<br>entangled state                      |
| common-cause,<br>noiseless | unit sphere,<br>left-<br>handed          |  |   | $\rho_{B A} \geq 0$<br>rank-one                        | pure, maximally<br>entangled bipartite<br>state       |

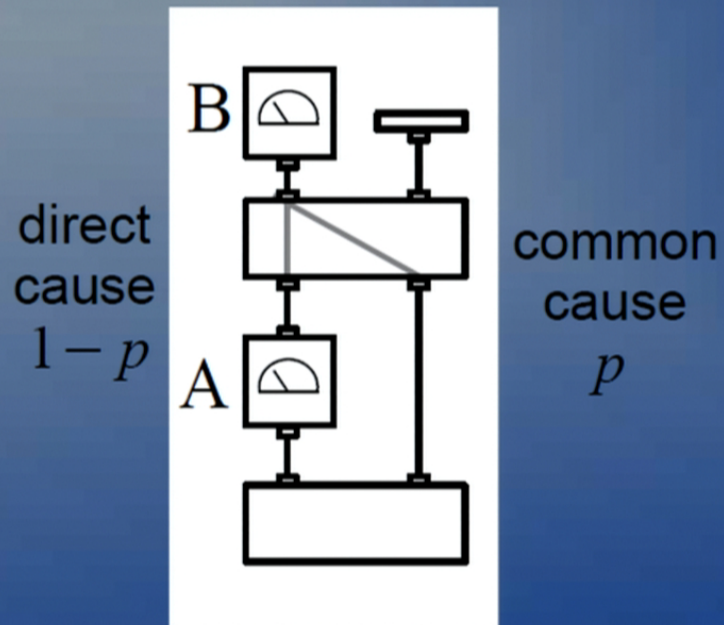
Method – the quantum advantage

\*S Jevtic, MF Pusey, D Jennings, T Rudolph, "The quantum steering ellipsoid". arXiv:1303.4724

# Results



## probabilistic mixture



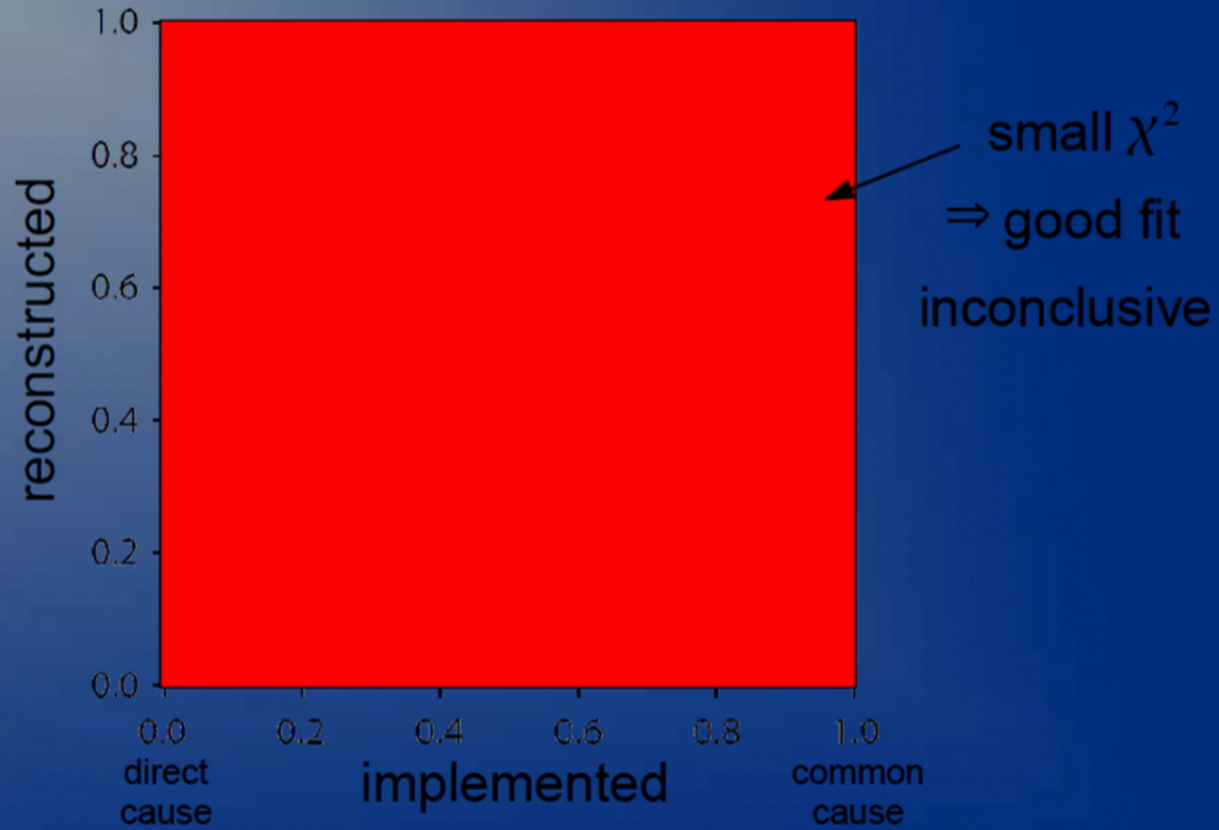
- implement  $p$
- collect data
- fit to
$$(1-p)\rho_{B|A}^{dc} + p\rho_{B|A}^{cc}$$
(minimize residue  $\chi^2$ )  
 $\Rightarrow$  reconstruct  $p$

Results



# Probability of common cause by passive observation

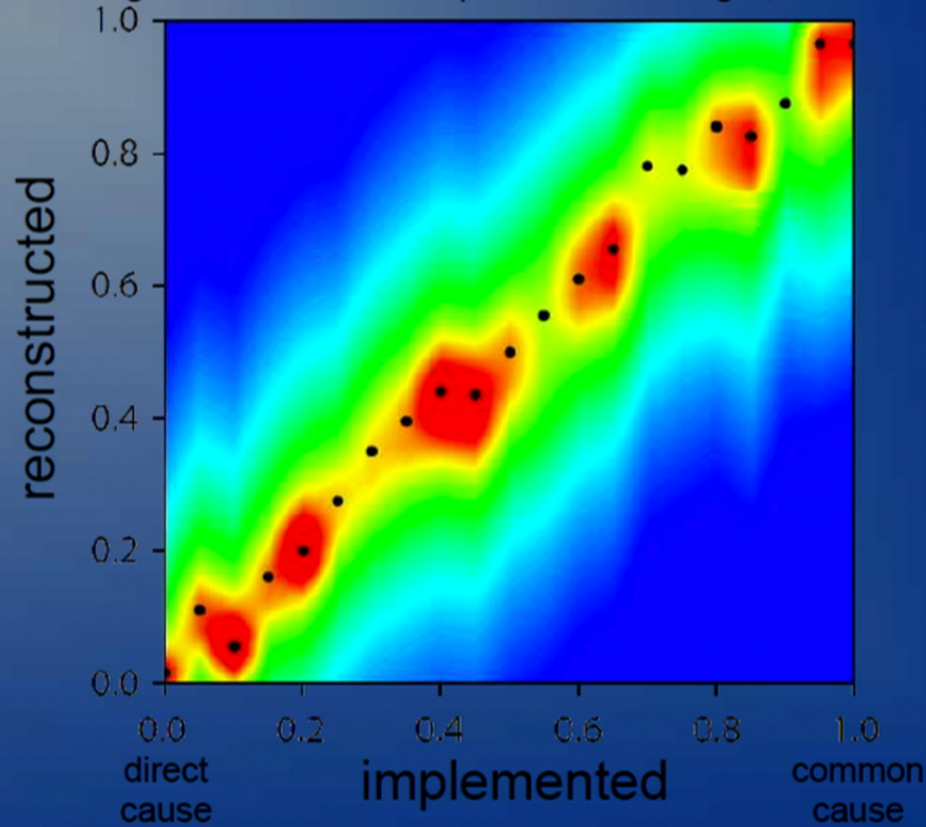
## Classical variables



Results

# Probability of common cause – experimental results

KR, M Agnew, L Vermeyden, D Janzing, RW Spekkens and KJ Resch,  
“Inferring causal structure: a quantum advantage”, arXiv:1406.5036



Results



Encore

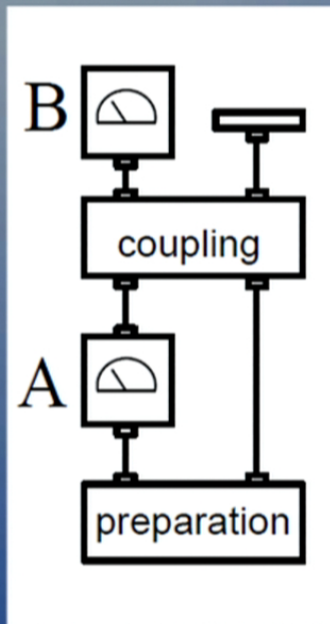
Causal Tomography

# Peculiarities of quantum conditionals II

coupling:  $U = \sqrt{1-p} \mathbf{1} + i\sqrt{p} U_{\text{swap}}$

Common-cause and direct-cause simultaneously

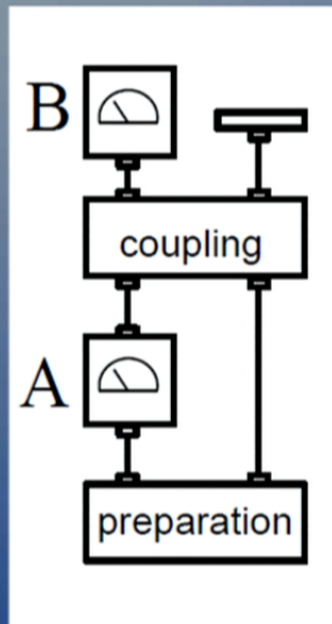
Map of inferences from A to B:



Encore: causal tomography



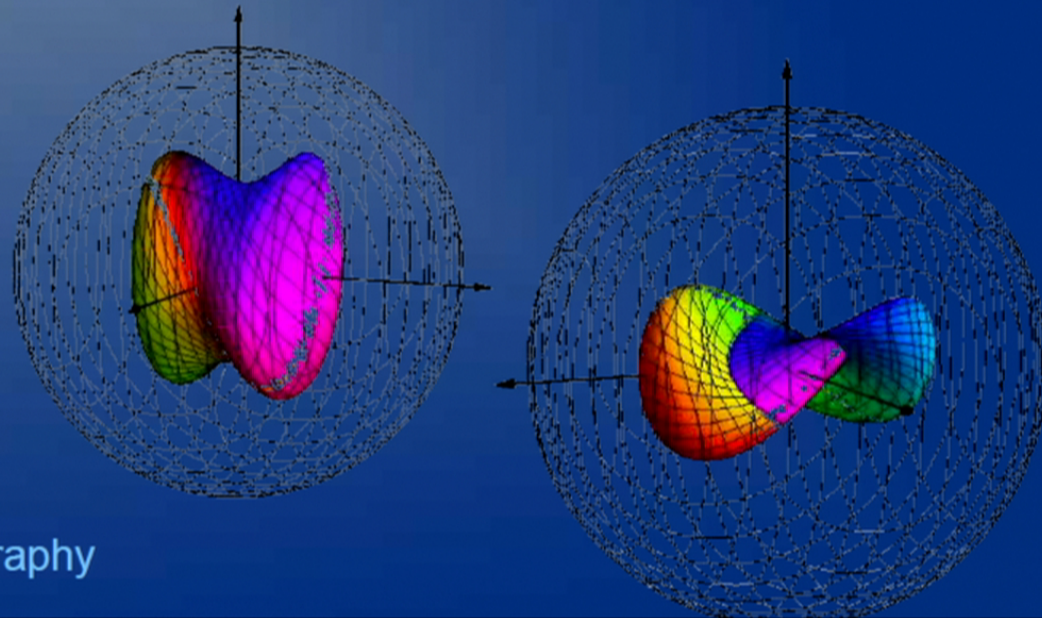
# Peculiarities of quantum conditionals II



coupling:  $U = \sqrt{1-p}\mathbf{1} + i\sqrt{p}U_{\text{swap}}$

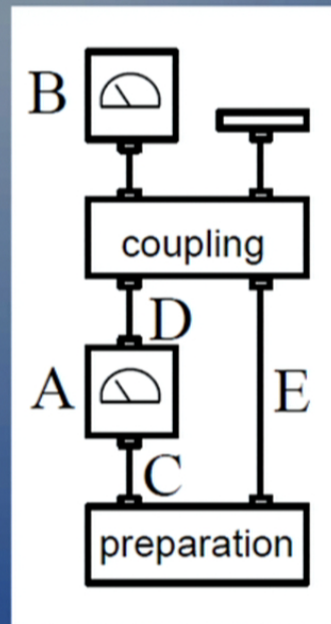
Common-cause and direct-cause simultaneously

Map of inferences from A to B:



Encore: causal tomography

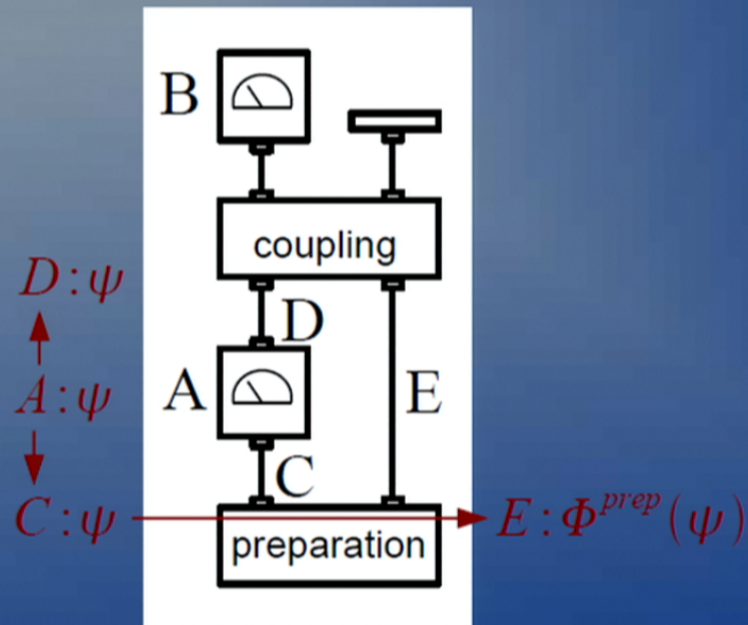
## Paths of inference



Encore: causal tomography



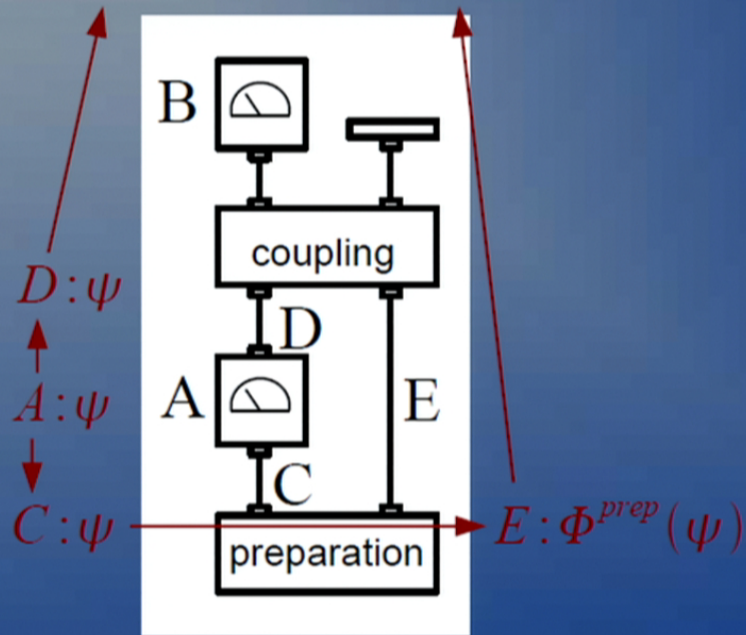
# Paths of inference



Encore: causal tomography

# Paths of inference

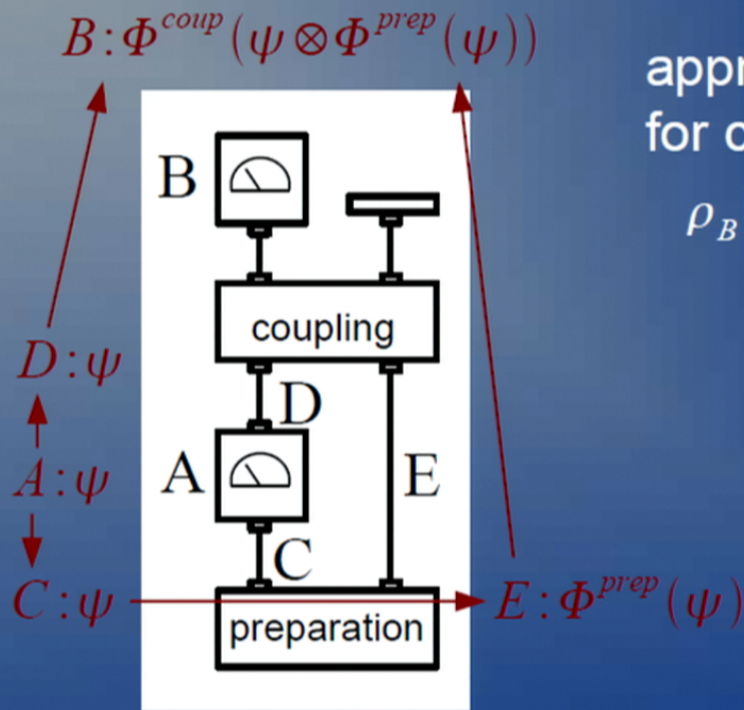
$$B: \Phi^{coup}(\psi \otimes \Phi^{prep}(\psi))$$



Encore: causal tomography



# Paths of inference

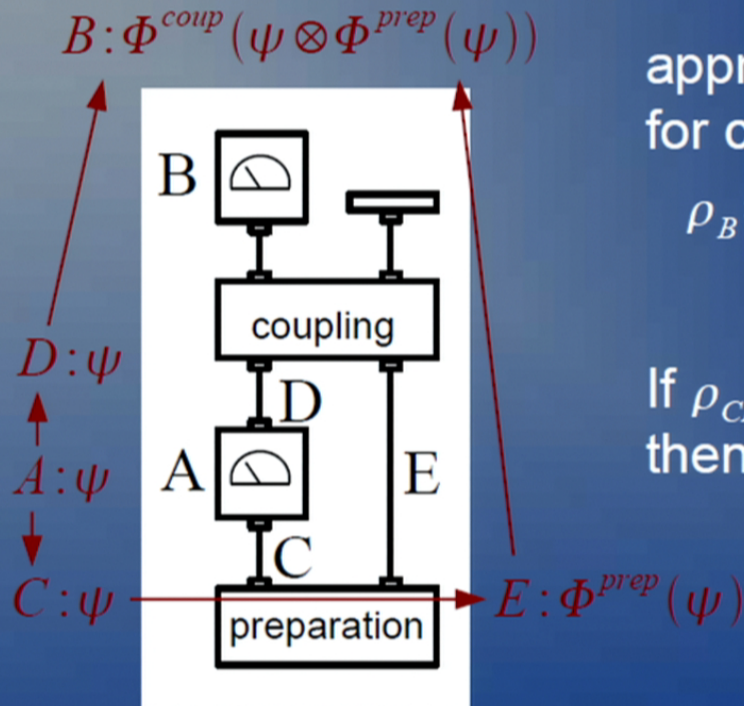


appropriate conditional for coherent superpositions:

$$\rho_B = Tr_{CD}(\rho_{B|CD} \rho_{CD})$$

Encore: causal tomography

## Paths of inference



appropriate conditional  
for coherent superpositions:

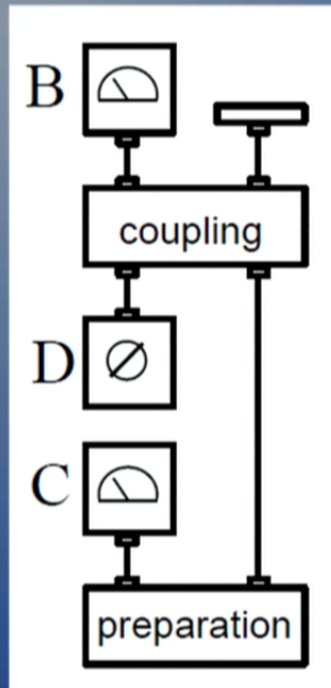
$$\rho_B = Tr_{CD}(\rho_{B|CD} \rho_{CD})$$

If  $\rho_{CD} = |\psi\rangle\langle\psi|_C \otimes |\psi\rangle\langle\psi|_D$   
then  $\rho_B$  is not linear in  $\psi$

Encore: causal tomography



# Causal tomography

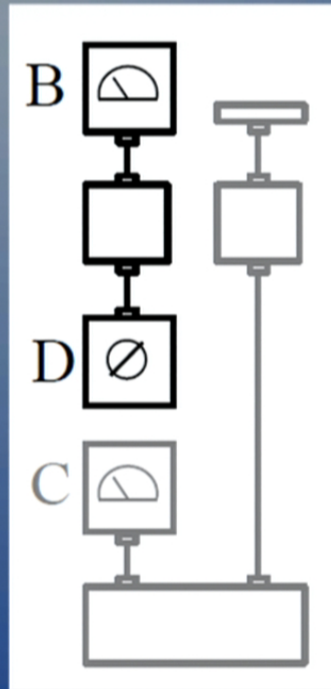


- characterizes what A tells us about B if their relation is both common-cause and direct-cause

$$\rho_{BC|D} = \sum_{stu} C_{stu} \sigma_u^B \otimes \sigma_s^C \otimes \sigma_t^D$$

Encore: causal tomography

# Causal tomography



- characterizes what A tells us about B if their relation is both common-cause and direct-cause

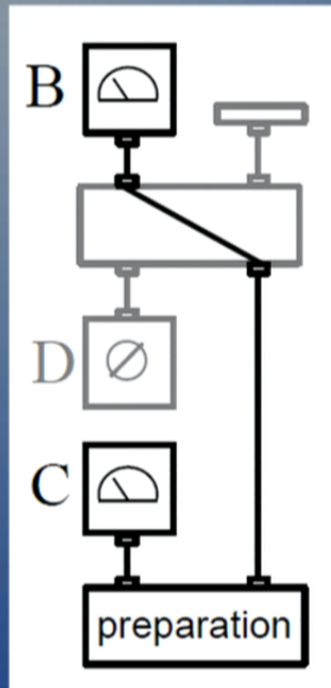
- purely direct-cause  
⇒ tomography of process

$$\rho_{BC|D} = \rho_{B|D} \otimes \rho_C$$

Encore: causal tomography



# Causal tomography



- characterizes what A tells us about B if their relation is both common-cause and direct-cause

- purely direct-cause  
⇒ tomography of process

- purely common-cause  
⇒ tomography of bipartite state

$$\rho_{BC|D} = \rho_{BC} \otimes \mathbf{1}_D$$

Encore: causal tomography

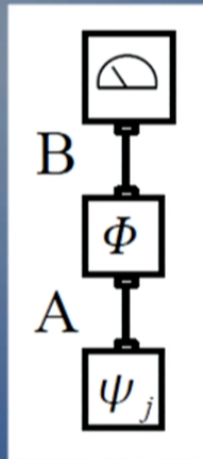




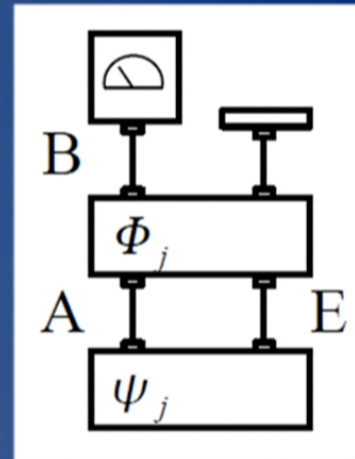
# Other projects

# Quantum process tomography in the presence of initial correlations

ideal:



real:



naive process tomography fails (eg not completely positive map)

⇒ want

- test for environmental back-action (detect non-Markovianity)
- characterize process despite these effects

Other projects: process tomography with initial correlations



# Quantum process tomography in the presence of initial correlations



known:

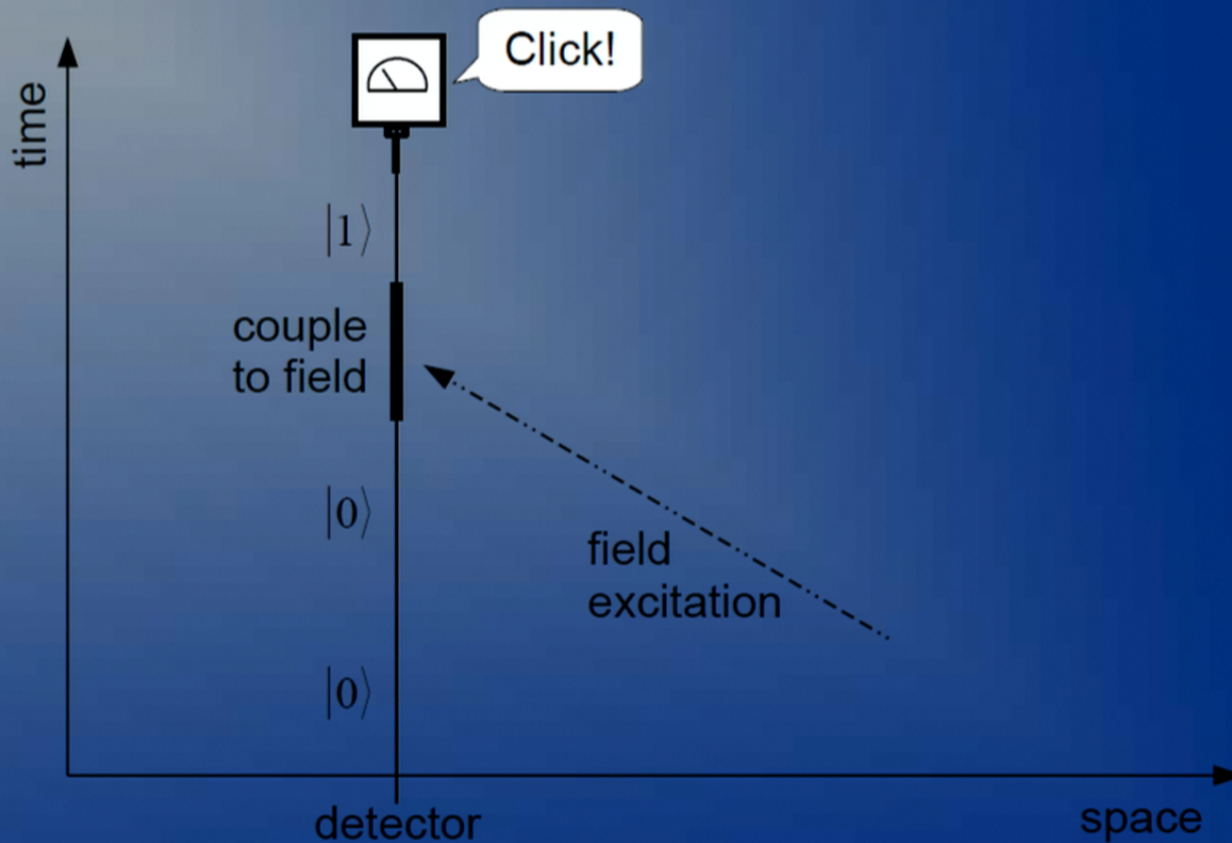
marginal input  $\rho_A^{(j)} = \text{Tr}_E(\rho_{AE}^{(j)})$   
output  $\rho_B^{(j)}$

wanted:

minimal dimension of E  
required to explain data

Other projects: process tomography with initial correlations

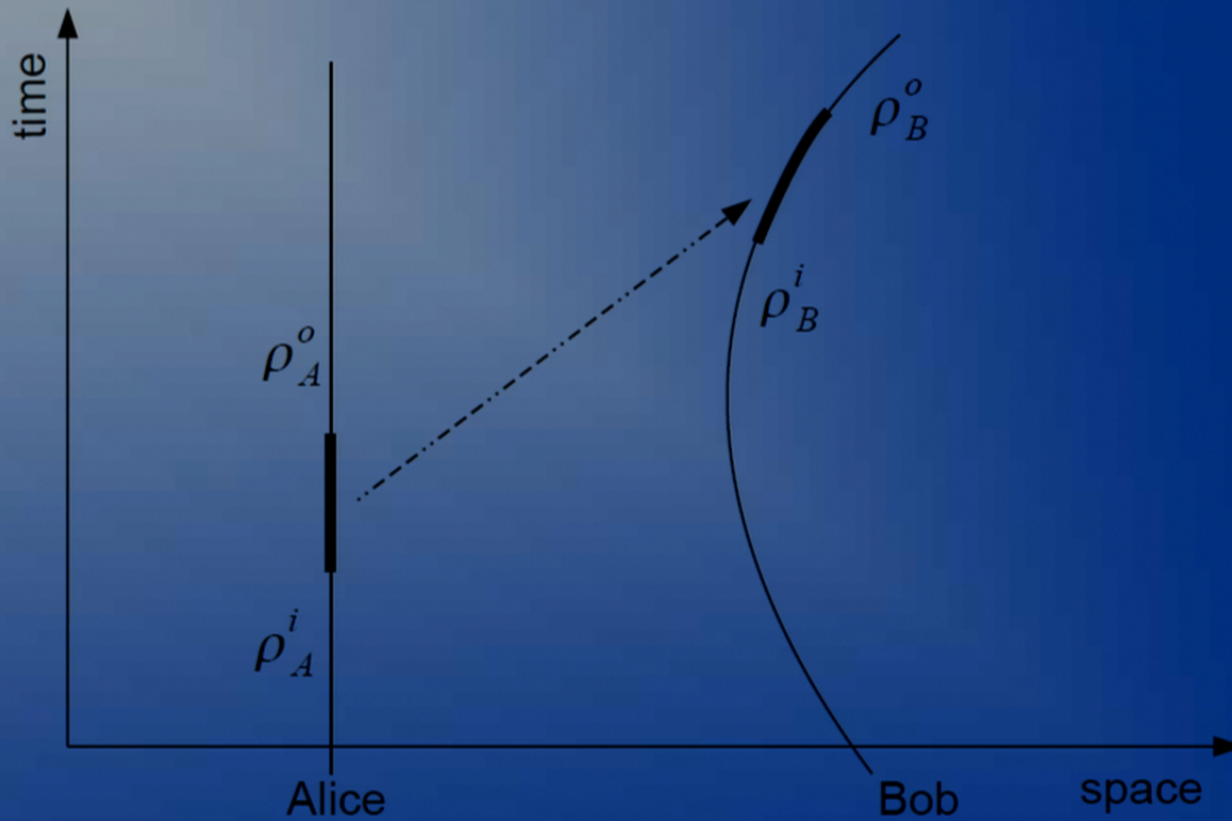
# Probing causality in quantum field theory



Other projects: causality in quantum fields



## Setup: two detectors in space-time



Other projects: causality in quantum fields

## Study causal influences:

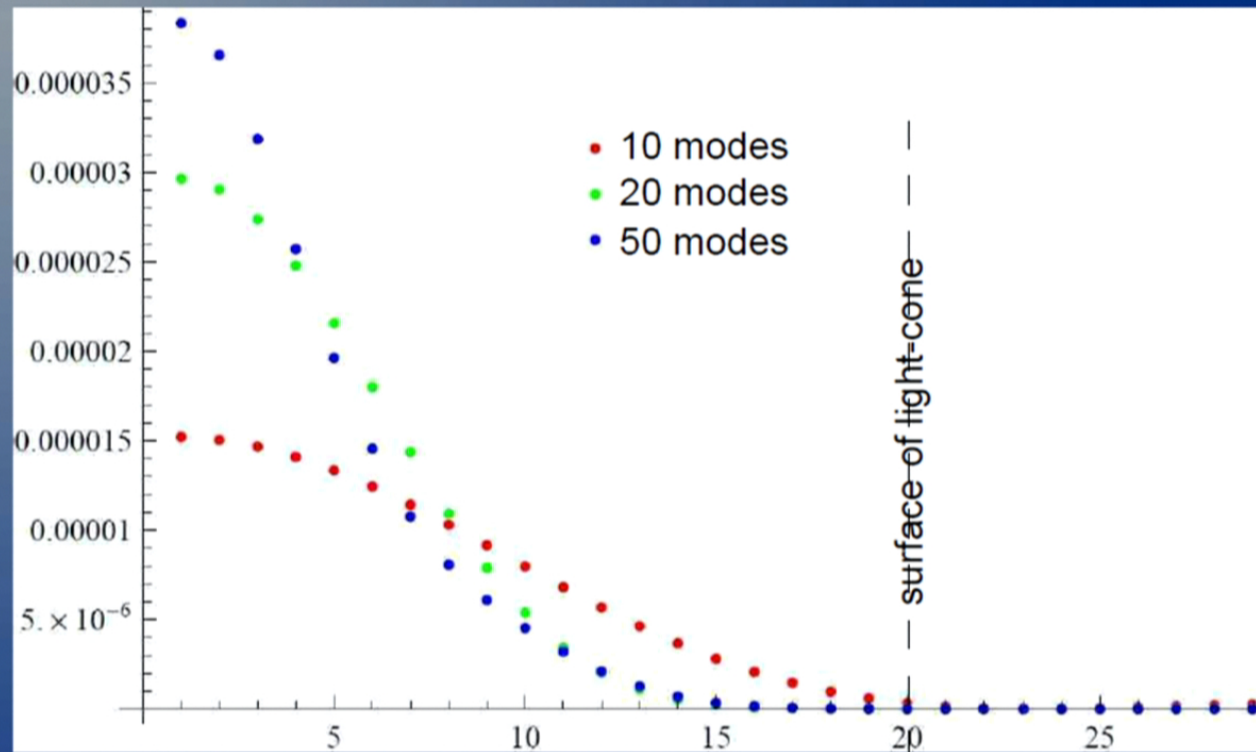
- structure
    - straightforward
  - qualify and quantify:
    - How much classical information is transmitted?
    - How much quantum information is transmitted?
    - ...
- ... as a function of
- space-time
  - acceleration
  - UV cut-off
  - switching function
  - ...

joint work with Eduardo Martín-Martínez,  
Robert Jonsson and Achim Kempf

Other projects: causality in quantum fields



## Mutual information vs spatial separation



see also RH Jonsson, E Martín-Martínez, A Kempf,  
"Quantum signaling in cavity QED", PRA 89, 022330

Other projects: causality in quantum fields

The End

