# An introduction to Information Theory and some of its applications: 

Université $\quad$ n
de Montréal Black Hole Information Paradox and Renormalization Group Information Flow

Fabio Grazioso - Univesrsité de Montréal - Laboratoir d'Informatique Théorique et Quantique

| Random variable $\begin{aligned} & x \quad(\text { variable }) \\ & \mathcal{A}_{X} \equiv\left\{a_{1}, a_{2}, \ldots, a_{n}\right\} \\ & \mathcal{P}_{X} \equiv\left\{p_{1}, p_{2}, \ldots, p_{n}\right\} \end{aligned}$ | $X \equiv\left(x, \mathcal{A}_{X}, \mathcal{P}_{X}\right)$ <br> (possible outcomes) (probabilities) |
| :---: | :---: |
| Information content (single outcome) $h\left(x=a_{i}\right) \equiv \log \frac{1}{p_{i}}$ | Entropy (info. content of whole variable) $H(X) \equiv \sum_{i} p_{i} \log \frac{1}{p_{i}}$ |

## Shannon's Source coding theorem

Vi.i.d. random variables each with entropy $\mathrm{H}(\mathrm{X})$ can be compressed into more than $\mathrm{NH}(\mathrm{X})$ bits with negligible risk of information loss, as $\mathrm{N} \rightarrow \infty$
conversely if they are compressed into fewer than $\mathrm{NH}(\mathrm{X})$ bits is is virtually certain



| Insights |  |  |
| :---: | :---: | :---: |
| - information content <br> is function of the probability only: | $\begin{gathered} \Rightarrow \quad \begin{array}{l} h(x)= \\ =\log [f(p)] \end{array} \left\lvert\, \begin{array}{l} \bullet \text { information content } \\ \text { maximal for equiprobable } \\ \text { distribution (see plot of } \\ \text { binary entropy in the ex- } \\ \text { ample on the left) } \end{array}\right. \\ \Downarrow \\ h\left(x=a_{i}\right)=\log \frac{1}{p_{i}} \end{gathered}$ |  |
| $h(x)=h[p(x)]$ |  |  |
| - joint probability of independent variables is the product: |  |  |
| $p(x, y)=p(x) p(y)$ |  |  |
| - intuition: information content is additive: |  |  |
| $h(x, y)=h(x)+h(y)$ |  |  |

## Quantum Information Theory

|  |  | Quantum Information Theory |
| :---: | :---: | :---: |
| Hilbert space $\begin{aligned} & \mathcal{H}=\operatorname{span}\{\|1\rangle, \ldots,\|n\rangle, \ldots\} \\ & \|\psi\rangle=c_{1}\|1\rangle+\ldots+c_{n}\|n\rangle+\ldots \\ & \forall i, c_{i} \in \mathbb{C} \end{aligned}$ | Qubit $\begin{aligned} & \mathcal{H}=\operatorname{span}\{\|0\rangle,\|1\rangle\} \\ & \|\psi\rangle=c_{0}\|0\rangle+c_{1}\|1\rangle \end{aligned}$ | Pure states \& mixed states $\left.\begin{array}{l} \rho_{0} \equiv\|0\rangle\langle 0\|=\binom{1}{0}(1,0)=\left(\begin{array}{ll} 1 & 0 \\ 0 & 0 \end{array}\right) \\ \rho_{\psi} \equiv\|\psi\rangle\langle\psi\|=\binom{c_{0}}{c_{1}}\left(c_{0}^{*}, c_{1}^{*}\right)=\left(\begin{array}{ll} c_{0} c_{0}^{*} & c_{0} c_{1}^{*} \\ c_{1} c_{0}^{*} & c_{1} c_{1}^{*} \end{array}\right) \end{array}\right\} \text { pure states }$ |
| Quantum complementarity |  <br> probabilities $\begin{aligned} & \left\{p_{0}=1, p_{1}=0\right\} \\ & \left\{p_{+}=0.5, p_{-}=0.5\right\} \end{aligned}$ | $\left\{\left\|\psi_{1}\right\rangle, \ldots,\left\|\psi_{n}\right\rangle\right\} \underset{\text { states }}{\text { possible }} ;\left\{p_{1}, \ldots, p_{n}\right\}$ probabilities <br> $\rho=\sum_{i} p_{i} \rho_{i}=\sum_{i} p_{i}\left\|\psi_{i}\right\rangle\left\langle\psi_{i}\right\| \quad$ mixed state |

## Holevo theorem

Suppose Alice prepares a state $\rho_{x}$ where $X=\left\{\left|x_{1}\right\rangle, \ldots,\left|x_{n}\right\rangle\right\}$ with probabilities $\left\{p_{1}, \ldots, p_{n}\right\}$.
Bob performs a measurement described by POVM $\left\{\hat{P}_{1}, \ldots P_{2}\right\}$ on that state, with measureme Bob performs a measurement described by POVM $\left\{P_{1}, \quad \hat{P}_{n}\right\}$ on that state, with measurement outcome Y For any such measurement Bob may do:

$$
I(X: Y) \leq S(\rho)-\sum_{x} p_{x} S\left(\rho_{x}\right)(\leq H(X))
$$

where $\rho=\sum p_{x} \rho_{x}$. The equality holds in the case the $\left\{\left|x_{1}\right\rangle, \ldots,\left|x_{n}\right\rangle\right\}$ are all orthogonal.

## No-cloning theorem



| $\left\{\left\|\psi_{1}\right\rangle,\left\|\psi_{2}\right\rangle\right\}$ |  |
| :--- | :--- |
| $0<\left\|\left\langle\psi_{1} \mid \psi_{2}\right\rangle\right\|<1$ | $\hat{U}\left(\left\|\psi_{i}\right\rangle\|0\rangle\right)$ |
| - org. copy | $\left\langle\psi_{i}\right\rangle\left\|\psi_{i}\right\rangle$ |
| orig. cepy |  |

## Black Hole Information Paradox



Black Hole complementarity
 two copies of the intormatio
are antill encod in wo
complementary bases. - So although hhere exist two
copies of the sane informa-
 at the same time,
same observer

Hawking, "Particle creation by black holes", Comm. math. phys., 43, 199 (1975)
Bekenstein, "Black holes and the second law", Lett. Nuovo Cimento, 4, 737 (1972)


| Renormalization Group Information Flux |  |
| :---: | :---: |
| Description of RG <br> - The dynamics of a composite system can be described by the interactions between its components. At a certain scale (graining) $\mu_{1}$ the elementary components sare defined, and the interaction constant $g$ between them. At an higher scale (more coarse graining) $\mu_{2}$, the elementary components can be "clusters" (blocs) of elementary com- ponents at the finer scale. At the higher scale the interacting constant is in principle changed. So in general we have an interaction constant which is function of the scale: $g\left(\mu_{i}\right)$. - The main idea of the Renormalization Group (RG) is to define an operator $\hat{G}$ which applied to the interaction constant at the smaller scale: <br> $g\left(\mu_{2}\right)=\hat{G} g\left(\mu_{1}\right) \quad$ (group operator action) <br> - The relationship between the group operator $\hat{G}$ and the interaction constant is described by the Callan-Symanzik equation, which enforces the consistency between the descriptions at different scales: $\left[m \frac{\partial}{\partial m}+\beta(g) \frac{\partial}{\partial g}+n \gamma\right] C^{(n)}\left(x_{1}, \ldots, x_{n} ; m, g\right)=0$ <br> Callan-Symanzik equation <br> where <br> C is the correlation function between the $\left(x_{1}, \ldots, x_{n}\right)$ elements of the system <br> $\beta, \gamma$ are two functions that "compensate" the effect of the scale change, in order for the description (i.e. the correlation function) at the different scales to be consistent. In $p$ stant, while $\gamma$ captures the change of the field itself. | Information flow <br> - In 1986 Zamolodchikov (see bibliography) proves that (in a 2D case) it is always possible to define a creases under the action of the RG operator. <br> - Because of this monotonicity, it is possible to give to this function the meaning of "inform tion flow" along the group transformation. <br> - This also gives rise to irreversibility under the group transformations: the group is not formally a group because there for each operator there is no $\qquad$ that despite the consistency, in the description at a coarse grained scale some finer scale has been lost. $\qquad$ mation Theory is an ideal tool to use for $c\left[g\left(\mu_{1}\right)\right] \leq c\left[g\left(\mu_{2}\right)\right]$ RG. |
| Bibliography: <br> Zamolodchikov, ""Irreversibility" of the Flux of the Renormalization Group in a 2D Field Theory", JET Preskill, "Quantum information and physics: some future directions", Journal of Modern Optics, 47, 127, Apenko, Information theory and renormalization group flows, Physica A, 391, 62 (2012) <br> Osborne, M A Nielsen, "Entanglement, quantum phase transitions, and density matrix renormalization", Qua Horacio Casini, Marina Huerta, "A c-theorem for entanglement entropy", Journal of Physics A, 40, 7031 (2007) | formation Processing, 1, 45 (2002) |

Renormalization Group Information Flux

Bibliography: "IIrreversibility" of the Flux of the Renormalization Group in a 2D Field Theory", JETP lett, 43, 730 (1986)
Zamolodchikov,

Apenko, Information theory and renormalization group flows, Physica A , 391,
Osborne, M
Osborne, M A A Nielsen, "Entanglement, quantum phase transitions, and density matrix renormalization", Quantuun
Horacio Casini, Marina Huerta, "A c-theorem for entanglement entropy", Journal of Physics A, 40, 7031 (2007)

