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# The Dolinar receiver in an information theoretic framework

by

*Baris I. Erkmen*, Kevin M. Birnbaum, Bruce E. Moision,  
and Samuel J. Dolinar

Jet Propulsion Laboratory, California Institute of Technology



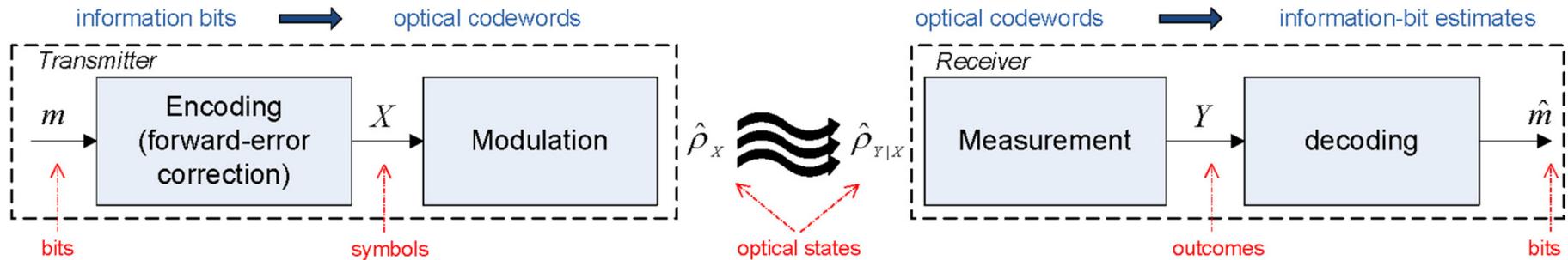
# Adaptive-feedback receivers

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- Preliminaries
  - Optical communication at the quantum limit
  - Dimensional and energy efficiency in optical communication
  - Binary coherent-state minimum probability of error measurement (Dolinar receiver)
- General formulation of adaptive-feedback receivers
- Optimal local oscillator for binary coherent-state constellation
- Optical local oscillator for ternary coherent-state constellation
- Conclusions



# Optical communication at the quantum limit

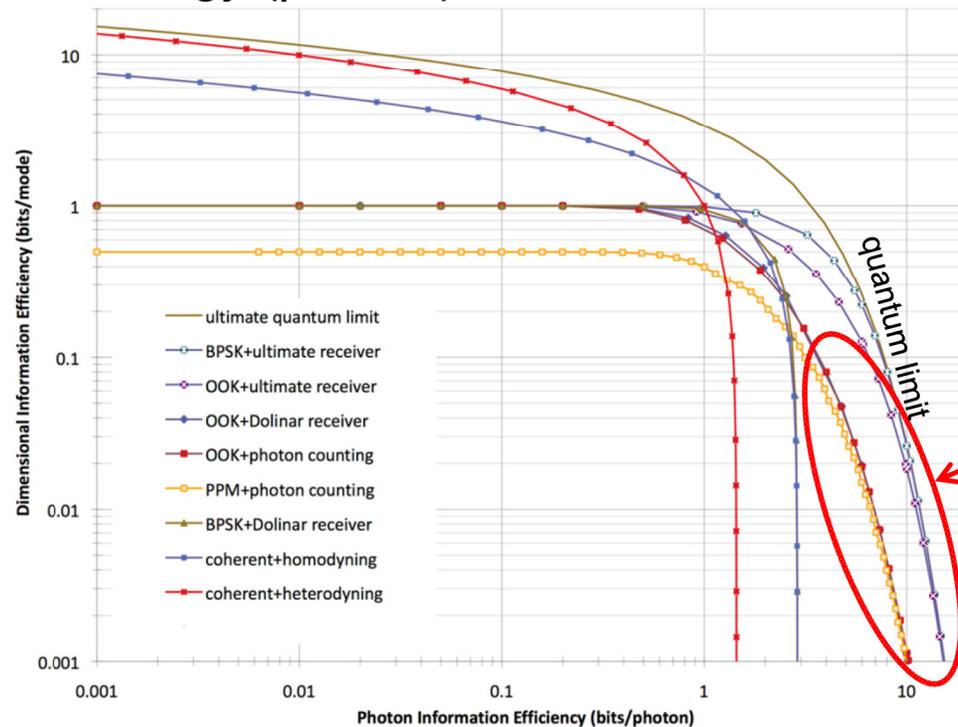


- Light is fundamentally quantum mechanical
- Measurements inherently yield random observations
- Statistics of measurement outcomes determine channel capacity
- The ultimate capacity of optical communications must therefore optimize over...
  - ...the alphabet of optical states
  - ...the priors for the optical states
  - ...the measurement at the receiver



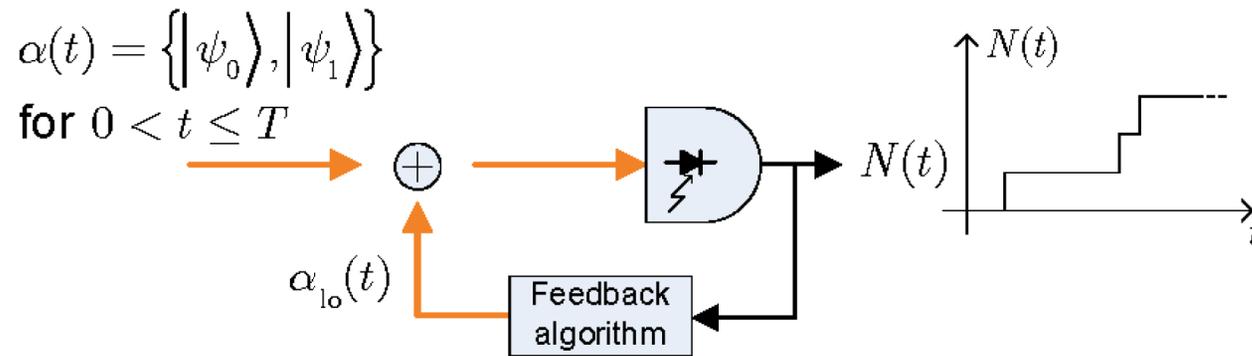
# Single-mode free-space capacity limits

- Dimensional information efficiency:  $c_d \equiv C/D$ 
    - units: *bits per dimension*
  - Photon information efficiency:  $c_p \equiv C/E$ 
    - units: *bits per unit-energy (photon)*
- capacity in bits per channel use      # dimensions: spatial, spectral, polarization etc.
- energy per channel use





# The Dolinar receiver



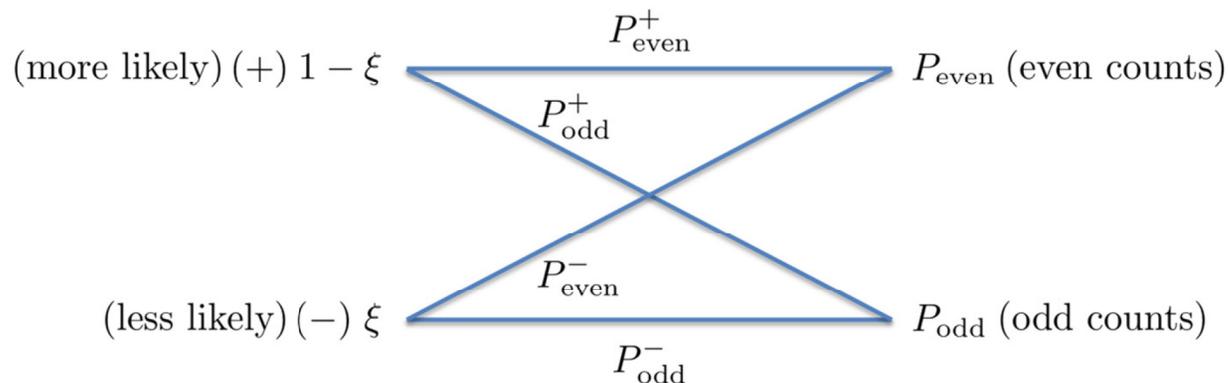
- Input state is one of two coherent states for  $0 < t \leq T$ 
  - $|\psi_0\rangle$  with probability  $\xi$ , and  $|\psi_1\rangle$  with probability  $1 - \xi$  ( $\xi < 1/2$ )
- Local oscillator field is  $|\alpha_{lo}(t)\rangle$ 
  - chosen to minimize the probability of error in distinguishing the two states in the next increment
- ML decision rule at the end of the observation interval:
  - if even number of photon-arrivals observed, then choose  $|\psi_1\rangle$
  - if odd number of photon-arrivals observed, then choose  $|\psi_0\rangle$

more likely hypothesis



# Minimum probability of error measurement

- Binary asymmetric channel with cross-over probabilities being a function of the *apriori* probabilities



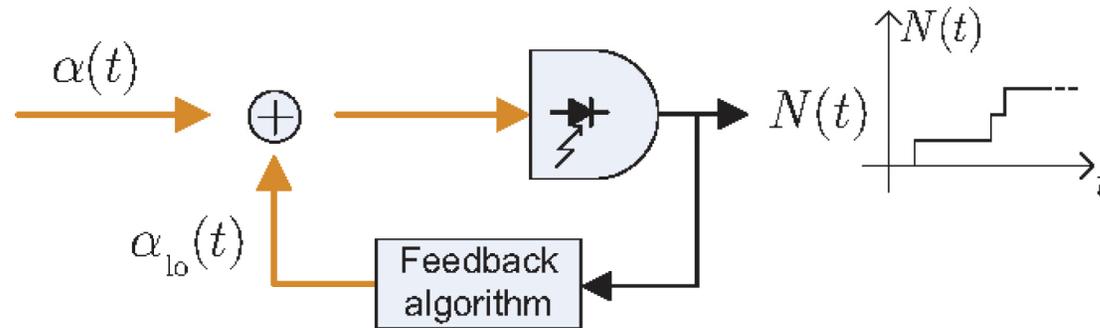
$$P_{\text{even}}^+ = \frac{1}{2} \left( 1 + \frac{1 - 2\xi s}{\sqrt{1 - 4\xi(1 - \xi)s}} \right) \quad P_{\text{even}}^- = \frac{1}{2} \left( 1 - \frac{1 - 2(1 - \xi)s}{\sqrt{1 - 4\xi(1 - \xi)s}} \right) \quad s \equiv |\langle \psi_0 | \psi_1 \rangle|^2$$

- The probability of error meets the Helstrom lower bound
  - lowest probability of error quantum mechanically permissible in distinguishing two coherent states

$$P_e = \xi P_{\text{even}}^- + (1 - \xi) P_{\text{odd}}^+ = \frac{1}{2} \left( 1 - \sqrt{1 - 4\xi(1 - \xi)s} \right)$$



# General formulation



- Input signal  $\alpha(t) = \alpha_k$  for  $0 < t \leq T$ ;  $\alpha_k \in \mathbb{C}$ ,  $k = 1, \dots, \mathcal{K}$ 
  - normalized such that  $\alpha(t)$  has units  $\sqrt{\text{photons/s}}$
  - $\alpha_k$  has a priori probability  $q_k$
- Local oscillator  $\alpha_{lo}(t)$  displaces incoming field
  - $\alpha_{lo}(t)$  is normalized to have units  $\sqrt{\text{photons/s}}$
- Photodetector is ideal
  - $\infty$ -bandwidth, unity quantum efficiency, and no dark counts
- $N(t)$  is a conditional inhomogeneous Poisson counting process with rate  $\lambda_k(t) = |\alpha_k + \alpha_{lo}(t)|^2$



# Differential mutual information

- The maximum rate of reliable information transfer is

$$C \equiv \max_{\{q_k\}, \alpha_{1o}(t)} I(K; \{N(t) : t \in (0, T]\})$$

- For given  $\{q_k\}$ , the chain rule for mutual information yields

$$\max_{\alpha_{1o}(t)} I(K; \{N(t) : t \in (0, T]\}) = \int_0^T dt E_N \left[ \underbrace{\max_{\alpha_{1o}(t)} \lim_{\Delta T \rightarrow 0} \frac{i(K; N(t + \Delta T) - N(t) | \{n(\tau) : \tau \in (0, t]\})}{\Delta T}}_{\text{differential mutual information: } i_d(t)} \right]$$

differential mutual information:  $i_d(t)$

- The differential mutual information for a Poisson process is

$$i_d(t) = -\bar{\lambda}(t) \log \bar{\lambda}(t) + \sum_{k=1}^{\mathcal{K}} p_k(t) \lambda_k(t) \log \lambda_k(t)$$

$\bar{\lambda}(t) \equiv \sum_k p_k(t) \lambda_k(t)$

$p_k(t) \equiv P(K = k | \{n(\tau) : \tau \in (0, t]\})$

$\lambda_k(t) \equiv |\alpha_k + \alpha_{1o}(t)|^2$

- $i_d(t) \geq 0$  because  $-\lambda \log \lambda$  is a concave function



# Critical points of solution

- Assume infinite modulation bandwidth for local oscillator
- Denote  $\alpha_{1o}(t) \equiv a(t) \exp(i\phi(t))$
- Differentiating  $i_d(t)$  with respect to  $a, \phi$  at each time  $t$  gives

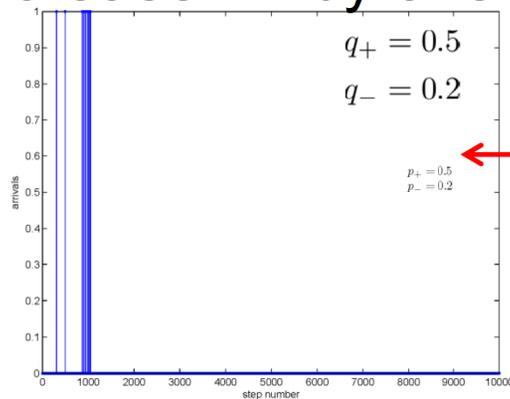
$$\left\{ \begin{array}{l} \sum_k p_k \log(\lambda_k/\bar{\lambda}) (a + |\alpha_k| \cos(\phi - \phi_k)) = 0 \\ \sum_k p_k \log(\lambda_k/\bar{\lambda}) \sin(\phi - \phi_k) = 0 \end{array} \right. \rightarrow \alpha_k \equiv |\alpha_k| e^{i\phi_k}$$

- *In principle* optimal local oscillator can be solved for arbitrary  $\{\alpha_k\}$ , but, *in practice* difficult to do analytically
  - Binary case has analytic solution
  - Higher-dimensional cases can be solved numerically
- If all  $\{\alpha_k\}$  are aligned on a line, then  $\alpha_{1o}(t)$  is on the same line



# Algorithm for simulating optimal feedback

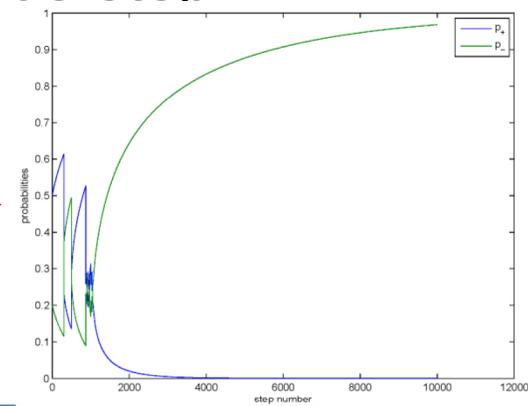
- Incremental form of the solution is suitable for simulation
- Initialize:
  - Choose true hypothesis using apriori probabilities  $\{q_k\}$
  - Set  $p_k(0) = q_k$ ; choose step size  $\Delta T$
- Repeat for  $m = 1, \dots, \lfloor T/\Delta T \rfloor$ 
  - Find optimal  $\alpha_{10}(m\Delta T)$  using  $p_k(m\Delta T)$
  - Simulate whether arrival occurs in next time increment  $(m + 1)\Delta T$
  - Update conditional probabilities,  $p_k((m + 1)\Delta T)$ , using Bayes' rule
- Increase  $m$  by one and return to previous step



Sample run:

Arrivals

Probability evolution





# Binary signaling constellation

- Assume BPSK input constellation  $\alpha_k \in \{|\alpha\rangle, |-\alpha\rangle\}$ 
  - subscript '+' refers to positive amplitude state
  - with probability  $p_-(0)$
  - with probability  $p_+(0) < 0.5$

- The solution to the optimality equations yields

$$\alpha_{lo}(t) = \frac{\alpha}{1 - 2p_+(t)}$$

- The probability product evolves deterministically, as

$$p_+(t)p_-(t) = p_+(0)p_-(0)e^{-4\alpha^2 t}$$

- The closed-form optimal local oscillator solution is

$$\alpha_{lo}(t) = \frac{\alpha(-1)^{N(t)}}{\sqrt{1 - 4p_+(0)p_-(0)e^{-4\alpha^2 t}}} \quad 0 < t \leq T$$

$\underbrace{p_+(0)p_-(0)}_{= 1 - p_+(0)}$

- Local oscillator is identical that of Dolinar Receiver!



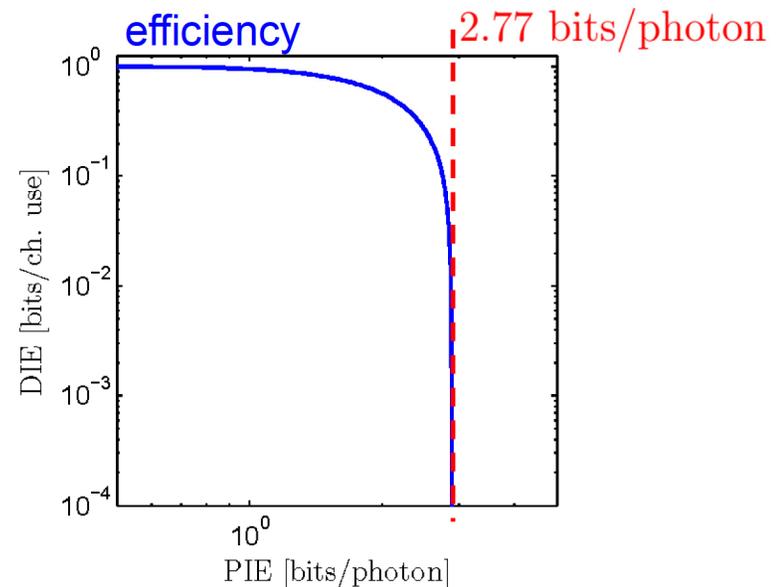
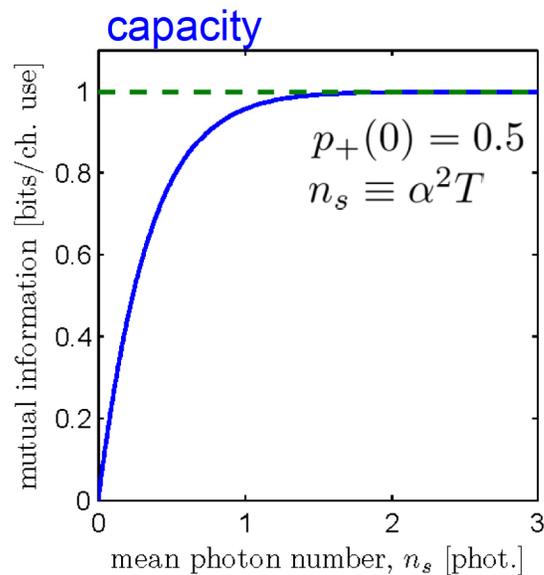
# Capacity of BPSK

- First evaluating  $i_d(t)$ , then the mutual information, we obtain

$$\max_{\alpha_{10}(t)} I(K; \{N(t) : t \in (0, T]\}) = h_2(p_+(0)) - h_2(P_{\text{er}})$$

$$P_{\text{er}} \equiv \frac{1}{2} \left( 1 - \sqrt{1 - 4p_+(0)(1 - p_+(0))e^{-4\alpha^2 T}} \right)$$

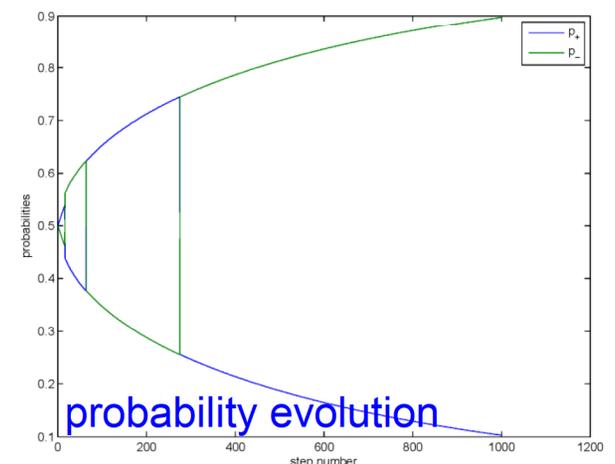
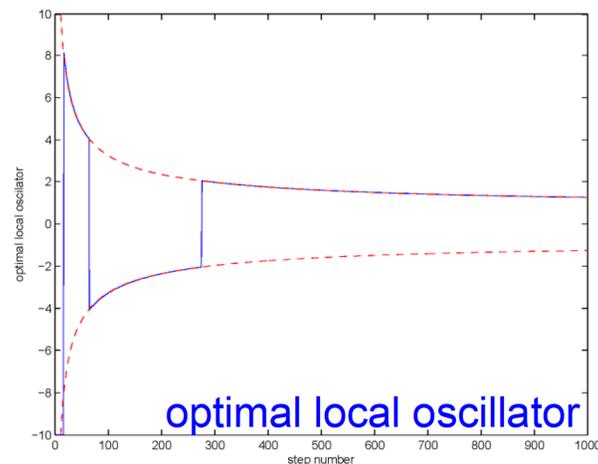
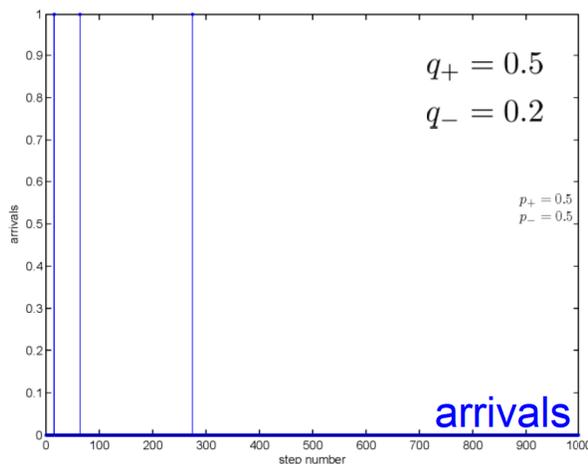
- Capacity and photon versus dimension efficiency plots





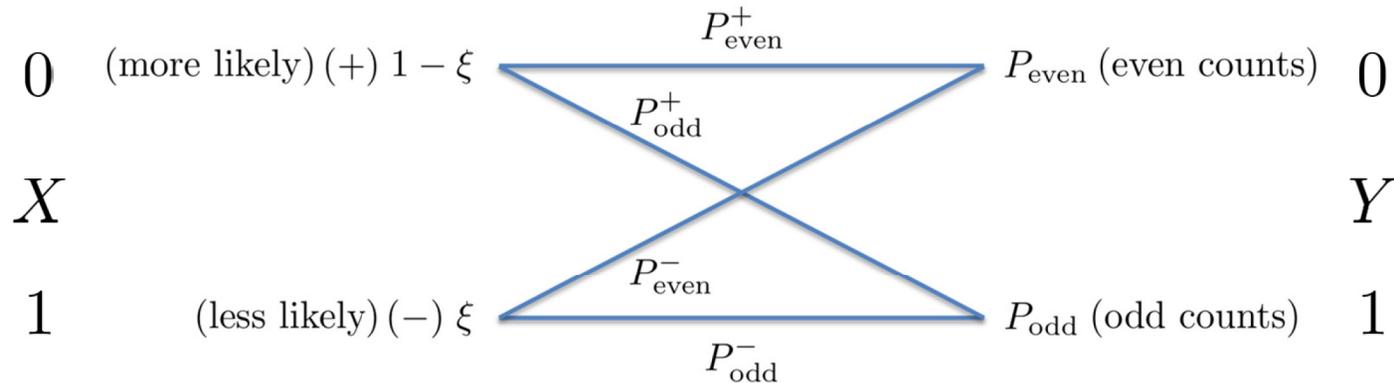
# The binary asymmetric channel

- The Dolinar receiver is a *hard-decision* receiver
  - At the end of every symbol, one of two hypotheses are chosen
- The adaptive receiver is a *soft-decision* receiver
  - The receiver is maximizes the mutual information between input and the output waveform (photon-counting process)
- The Dolinar receiver and mutual-information maximizing adaptive receiver have the *same* capacity
  - No ‘soft information’ is obtained by resolving the count epochs





# The Dolinar receiver: revisited



- The mutual information of the binary asymmetric channel is

$$I(X; Y) = H(X) - H(X|Y)$$

- The mutual information of the adaptive feedback receiver is

$$I(X; Y) = H(X) - h_2(P_{\text{er}}) \rightarrow H(X|Y) = h_2(P_{\text{er}})$$

- This holds because  $P_{\text{odd}}^+$  and  $P_{\text{even}}^-$  are such that

$$H(X \oplus Y|Y) = H(X \oplus Y)$$



# Arbitrary binary coherent-state constellation

- Earlier derivations for BPSK extend trivially to arbitrary binary coherent states
- Assume the states are  $\{|\alpha_1\rangle, |\alpha_2\rangle\}$ ,  $\alpha_1, \alpha_2 \in \mathbb{C}$ , and have apriori probability distribution  $\{q_1, 1 - q_1\}$

- The optimal local oscillator must be

$$\alpha_{lo} = -\frac{1}{2}(\alpha_1 + \alpha_2) + e^{j\theta} \alpha'_{lo}$$

$$\theta \equiv \angle(\alpha_1 - \alpha_2)$$

optimal local oscillator for the real-valued, and antipodal constellation  $\{ -|\alpha_1 - \alpha_2|/2 \rangle, |\alpha_1 - \alpha_2|/2 \rangle \}$ , and apriori distribution  $\{q_1, 1 - q_1\}$

- Proof is by contradiction



# A ternary signaling constellation

- Assume ternary input constellation  $\alpha_k \in \{|-\alpha\rangle, |0\rangle, |\alpha\rangle\}$ 
    - subscript '+' refers to positive amplitude state
    - subscript '-' refers to negative amplitude state
- with probability  $p_-(0)$   
with probability  $p_0(0)$   
with probability  $p_+(0)$

- Analytical solution to the optimality equations is intractable, yet, it can be solved numerically
- As an alternative we propose the following local oscillator function, whose performance is very close to optimal

$$\alpha_{lo}(t) = \begin{cases} \alpha \frac{1+p_-(t)+p_+(t)}{2(p_-(t)-p_+(t))} & \text{for } f(p_+(t), p_-(t)) > 0 \\ 0 & \text{otherwise} \end{cases}$$

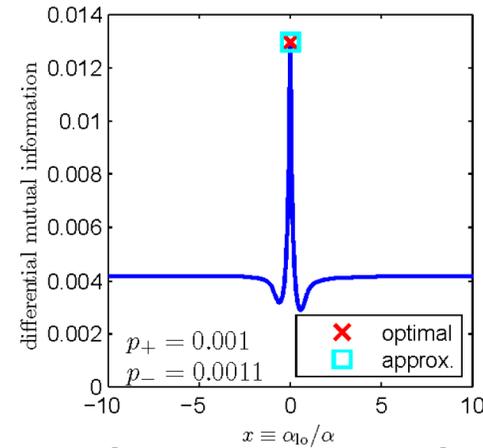
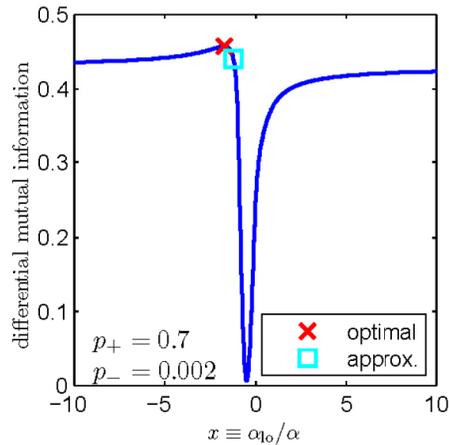
difference of mutual information attained with the two local-oscillator possibilities

- The first case solution satisfies  $\frac{d}{dt} \prod_{k=\{-,0,+\}} p_k(t) = -5\alpha^2 \prod_{k=\{-,0,+\}} p_k(t)$  between detection epochs

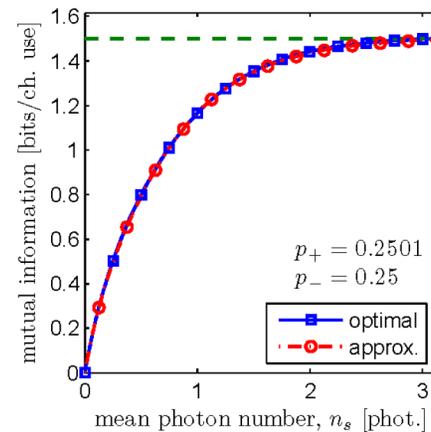
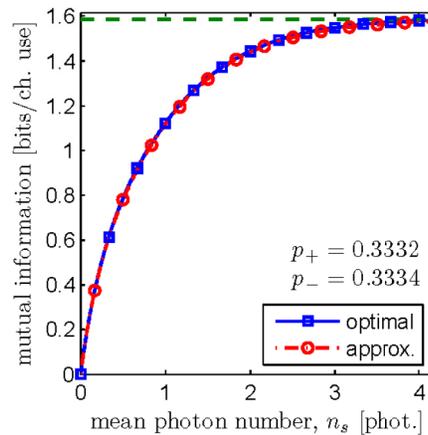


# Optimal versus approximate local oscillator

- Difference in  $i_d(t)$  attained with the optimal and approximate local oscillators is small, and...



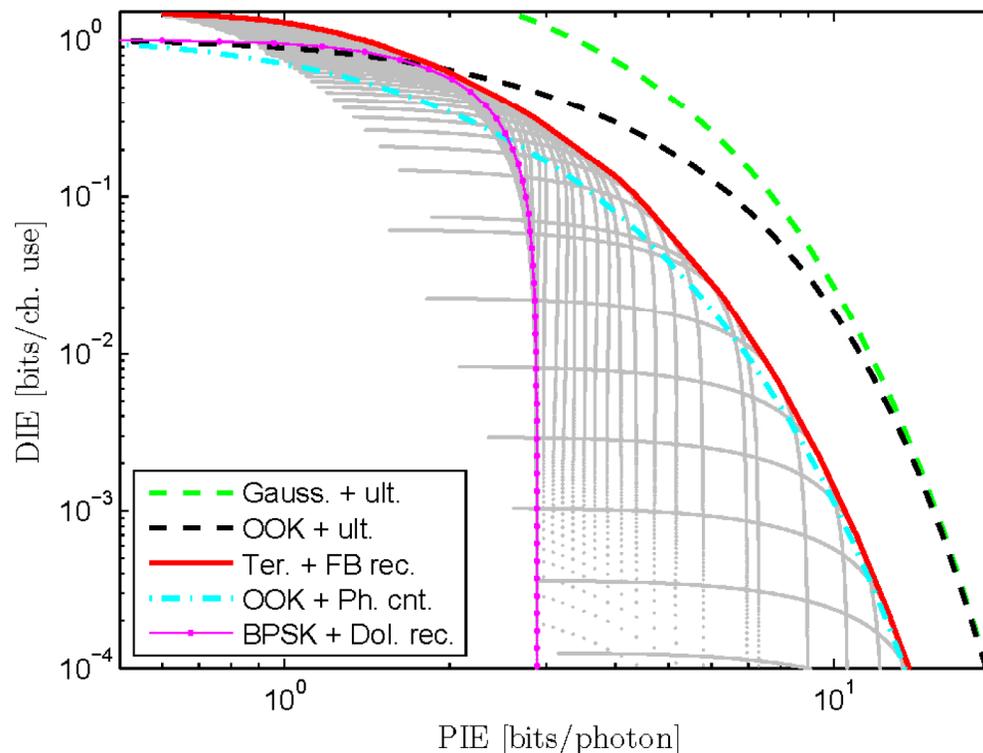
- ...the mutual information agreement is very good





# Capacity of ternary constellation

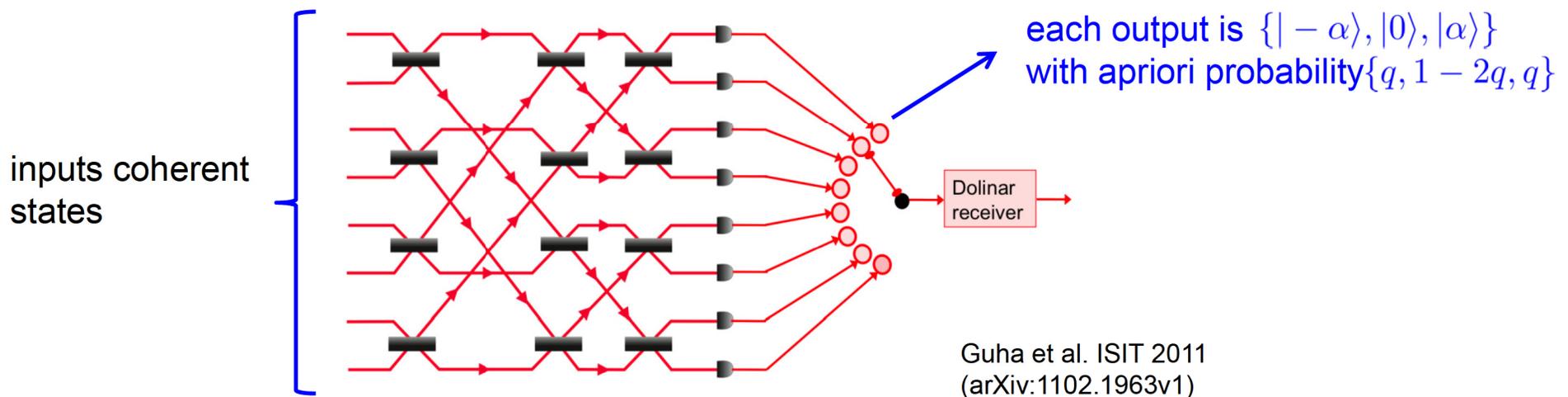
- Photon information efficiency (PIE) versus dimensional information efficiency (DIE) tradeoff
  - Adding the vacuum state overcomes finite PIE asymptote of BPSK
  - Better than OOK + photon-counting but gains diminish at high PIE





# An adaptive-feedback receiver

- Guha *et al.* (ISIT 2011) use an adaptive-feedback receiver with for this ternary constellation
  - local oscillator is set to zero until a click is registered
  - once a photon is detected, the Dolinar receiver is applied in the remaining duration





## Optimality of adaptive-feedback receiver

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- Setting  $p_+(0) = p_-(0)$  in our approximation to the optimal local oscillator, we find that  $\alpha_{1o}(0) = 0$  is *optimal* when

$$q < 0.5e^{-2} \approx 0.068$$

- $\alpha_{1o}(t) = 0$  remains optimal as long as  $N(t) = 0$
  - If an arrival is registered at  $t_1$ ,  $p_0(t_1^+) = 0$ ,  $p_+(t_1^+) = \frac{1}{2}$ ,  $p_-(t_1^+) = \frac{1}{2}$ , so the constellation reduces to binary and the Dolinar receiver becomes optimal adaptive-feedback receiver
  - This strategy is optimal for  $\text{PIE} \geq 2.5$  bits/photon
  - Hybrid BPSK + Pulse-Position Modulation (PPM), with PPM order  $\geq 8$  satisfies  $q < 0.068$
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# Conclusions

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- Adaptive-feedback based optical communication receivers for coherent states are studied in an information-theoretic setting
    - local oscillator is incrementally optimized
  - Dolinar receiver is the optimal adaptive-feedback receiver in the binary case
    - no soft information
  - BPSK+vacuum-state local oscillator can be approximated in partially-closed form
    - “wait for a photon, then apply the Dolinar receiver” is an optimal feedback strategy when non-vacuum states satisfy  $q < 0.068$
  - Analysis framework can be applied, in principle, to arbitrary coherent-state constellations
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