

INSTITUT  
POLYTECHNIQUE  
DE PARIS



# Semiconductor Lasers

## High-speed & Nonlinear Dynamics

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## Textbooks

- [1] J. M. Liu, *Photonic Devices*, Cambridge University Press
- [2] L. A. Coldren & S. W. Corzine, *Diode Lasers and Photonic Integrated Circuits*, Wiley
- [3] P. Blood, *Quantum Confined Laser Devices*, Oxford University Press
- [4] J. Faist, *Quantum Cascade Lasers*, Oxford University Press
- [5] J. Ohtsubo, *Semiconductor Lasers*, Springer
- [6] T. Erneux & P. Glorieux, *Laser Dynamics*, Cambridge
- [7] A. Uchida, *Optical Communications with Chaotic Lasers*, Wiley



# *Let there be light...*

## LASER: Light Amplification by Stimulated Emission of Radiation

Laser light is monochromatic, i.e., consisting of a single wavelength or color, and emitted in a narrow beam

T. H. Maiman was an American engineer and physicist credited with the invention of the first working laser. The laser was successfully fired on May 16, 1960

The laser disc player (1978), was the first successful consumer product to include a laser, but the compact disc player was the first laser-equipped device to become truly common in consumers' homes, beginning in 1982, followed shortly by laser printers

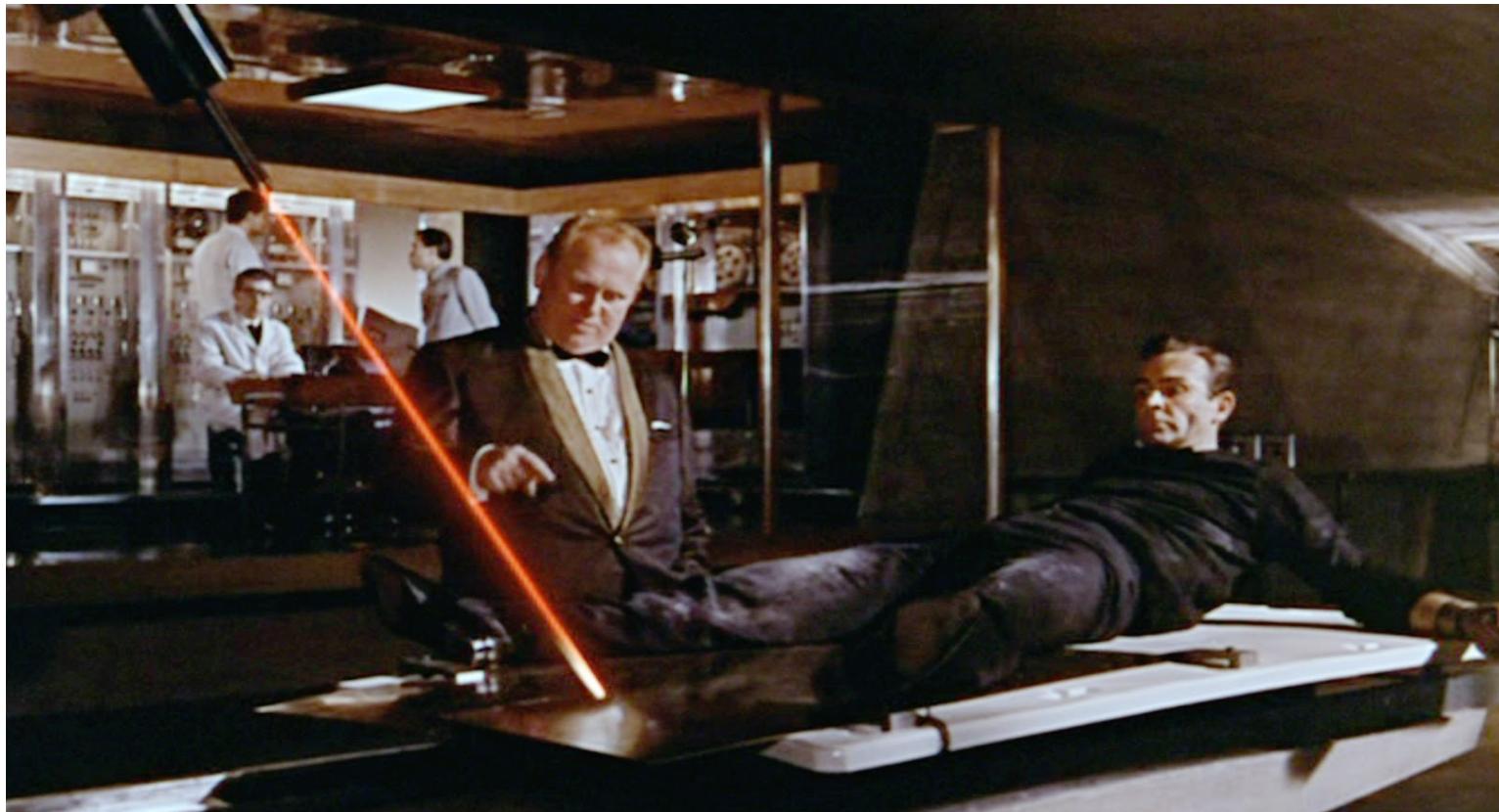


Theodore Maiman  
(1927-2007)

T. H. Maiman, Journal of the Optical Society of America, vol. 50, pp. 1134, (1960)

**...and more!**

**Goldfinger (1964) was the first film to feature a laser**



**Lasers did not exist in 1959 when the book was written. In the novel, Goldfinger uses a circular saw to try to kill Bond, but the filmmakers changed it to a laser to make the film feel more fresh**



# High-speed lasers

# Modulation dynamics



# *Outline*

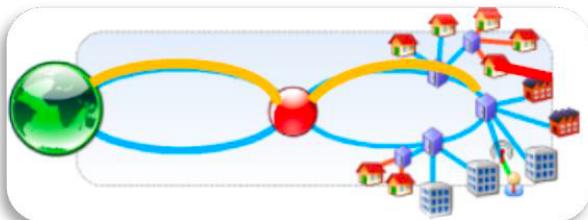
- **Introduction to optical communications**
- **High speed lasers**
- **Semiconductor lasers: Basic principles**
- **Corpuscular equations**
- **Modulation dynamics**

# Optical communications

## TELECOM

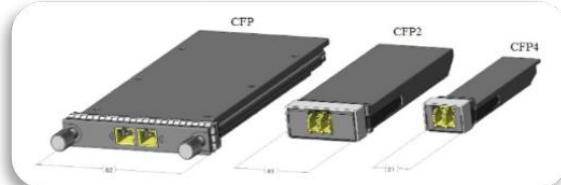
> 10 km

➤ Metro & Access



■ 1.5 μm

➤ Transceivers modules



## DATACOM

■ 1m – 10 km

➤ Routers & switches



■ 1.3 μm

➤ Rack-to-rack

➤ Board-to-board



## COMPUTERCOM

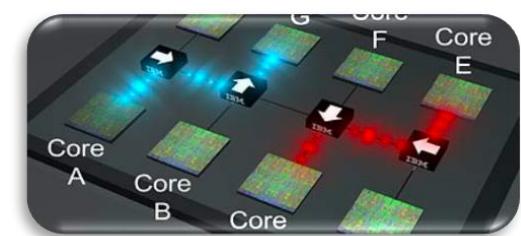
■ < 1m

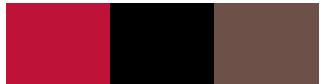
➤ Photonics integrated circuits



■ 1.3 μm

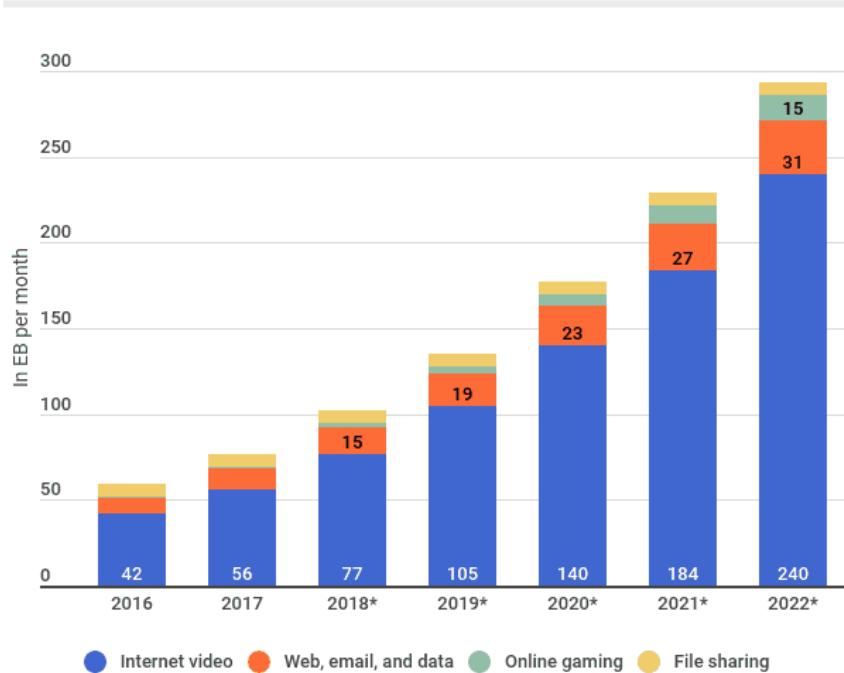
➤ Transceivers on chip





# Optical communications

Predicted worldwide internet traffic (1EB =  $10^{18}$ )

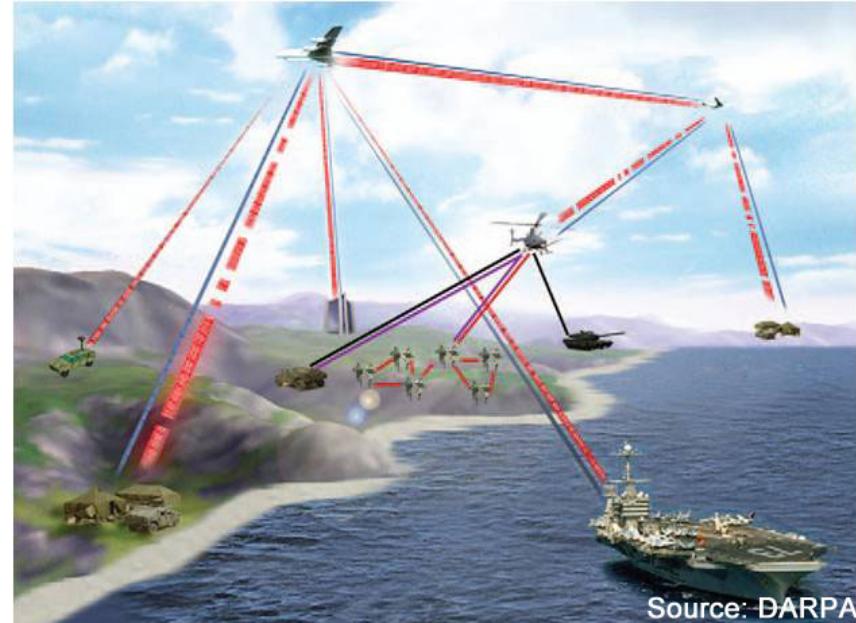


Sources: Cisco Systems

Created by Dailywireless.org

## Optical link

- 1000 x Larger bandwidth
- 1000 x Lower loss
- 100 x Larger distance

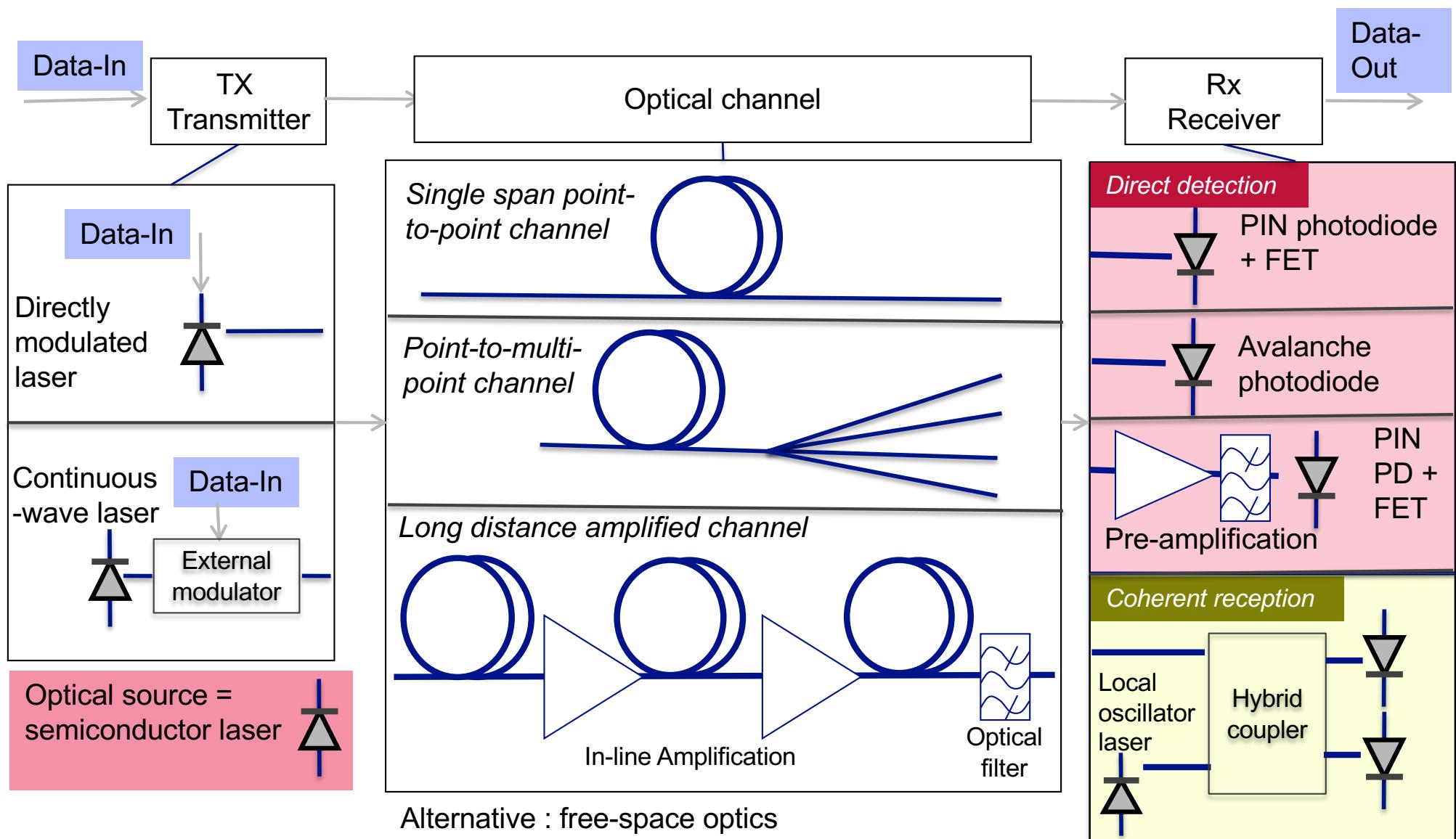


Source: DARPA

Scalability & power efficiency

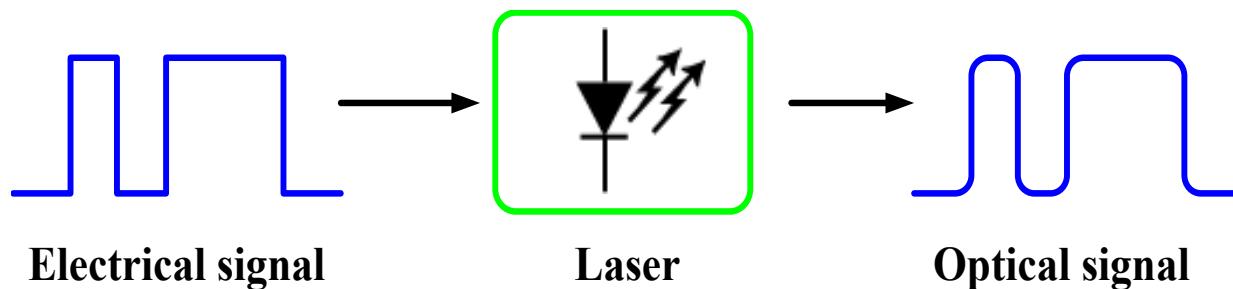
Free-space optical  
communications ramping up

# Architecture of an optical link



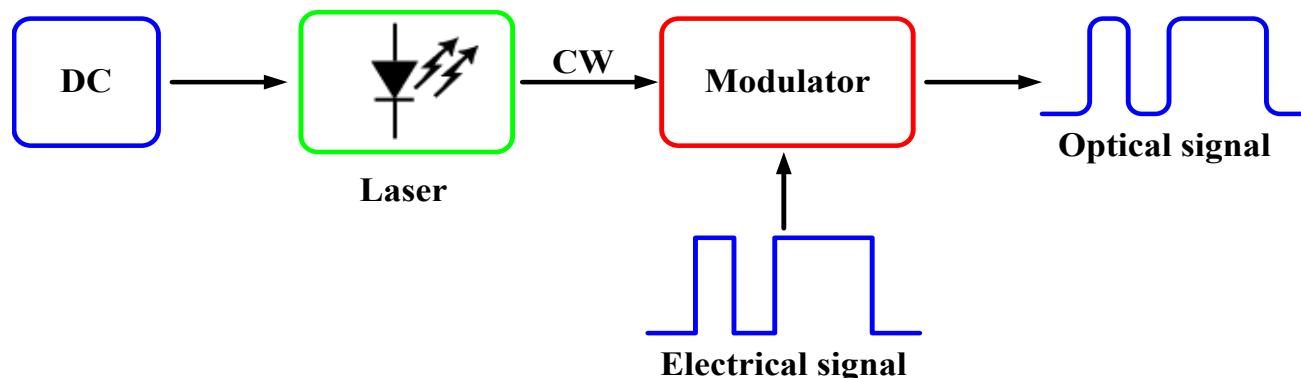
# Modulation schemes

## Direct modulation



- Chirp
- Simple
- Compactness
- Low cost
- Energy efficient

## External modulation

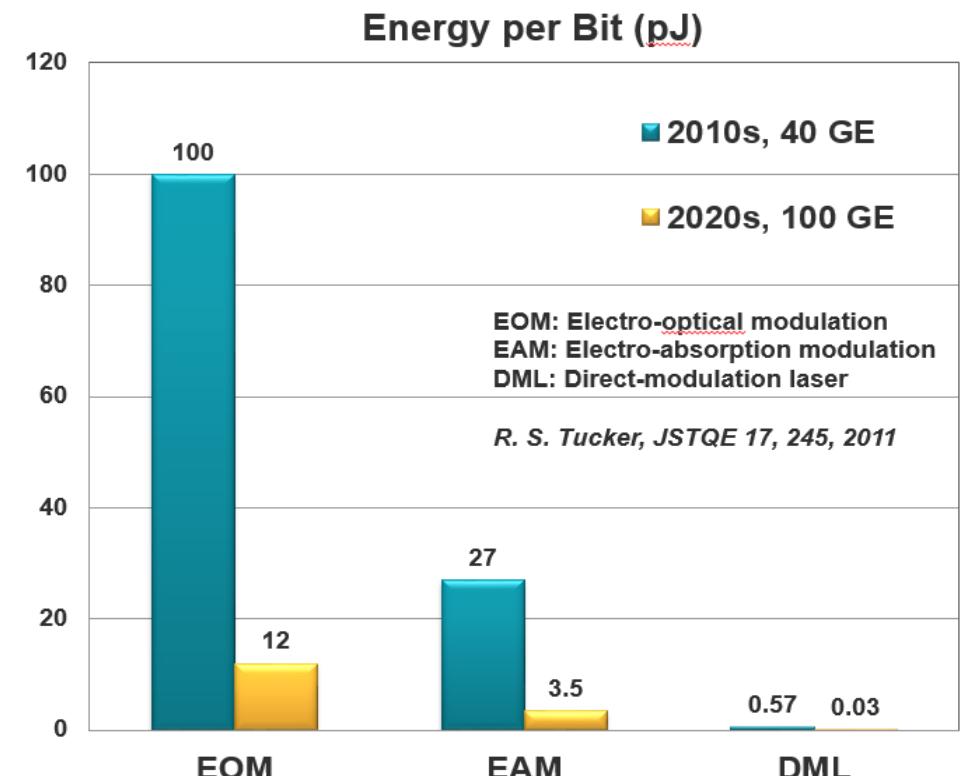


- Power consumption
- Cost
- High-speed
- Zéro chirp

T. Anfray et al., Journal of Lightwave Technology, vol. 30, pp. 3089, (2012)

# Energy consumption

Transmitter Type	Component	Energy per Bit	
		2010-era technology (40 Gb/s)	2020-era Target (100 Gb/s)
	MUX	10 pJ	2 pJ
Directly Modulated	Laser ( $\bar{V}_{laser} \bar{I}_{laser}$ )	358 fJ	10 fJ
	Driver ( $P_{driver} / B_r$ )	212 fJ	20 fJ
	Laser + Driver	570 fJ	30 fJ
Externally Modulated (Electro-Absorption)	Laser ( $\bar{V}_{laser} \bar{I}_{laser} / B_r$ )	1.5 pJ	500 fJ
	Lumped $V_{mod} = 3$ V	$\frac{1}{2} C_{mod} (V_{mod}^{p-p})^2$	800 fJ
		$2 \hat{V}_{mod}^2 / Z_0 B_r$	4 pJ
		$\bar{V}_{mod} \bar{I}_{mod} / B_r$	1.5 pJ
	TW $V_{mod} = 1$ V	$2 \hat{V}_{mod}^2 / Z_0 B_r$	440 fJ
		$\bar{V}_{mod} \bar{I}_{mod} / B_r$	500 fJ
	Driver ( $P_{driver} / B_r$ )	25 pJ	100 fJ ( $C_{mod}$ ) 3 pJ ( $Z_0$ )
	Laser + Driver	27 pJ	600 fJ ( $C_{mod}$ ) 3.5 pJ ( $Z_0$ )
Externally Modulated (Electro-Optic)	Laser ( $\bar{V}_{laser} \bar{I}_{laser} / B_r$ )	1.5 pJ	500 fJ
	$2 \hat{V}_{mod}^2 / Z_0 B_r$	4 pJ	1.6 pJ
	Driver ( $P_{driver} / B_r$ )	25 pJ	3 pJ
	Laser + 4 Drivers	~ 100 pJ	12 pJ



R. S. Tucker, IEEE J. Sel. Top. Quantum Electron. 17, pp. 245 (2011)

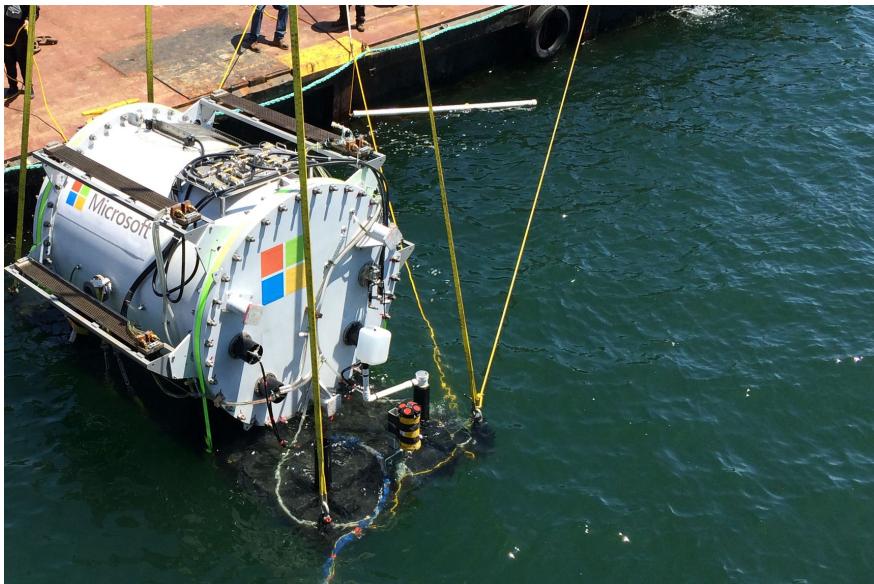
# Energy consumption

An optical datacenter burns about 1000 TWh

Air cooling represents 50% of the total energy consumption ie. 1kW used for running a server needs an additional 1kW to maintain to cool it down that is to say to maintain its temperature to 22°C

→ Microsoft : under the sea data centers powered by renewable energy

→ Facebook: datacenters near the edge of the Artic circle



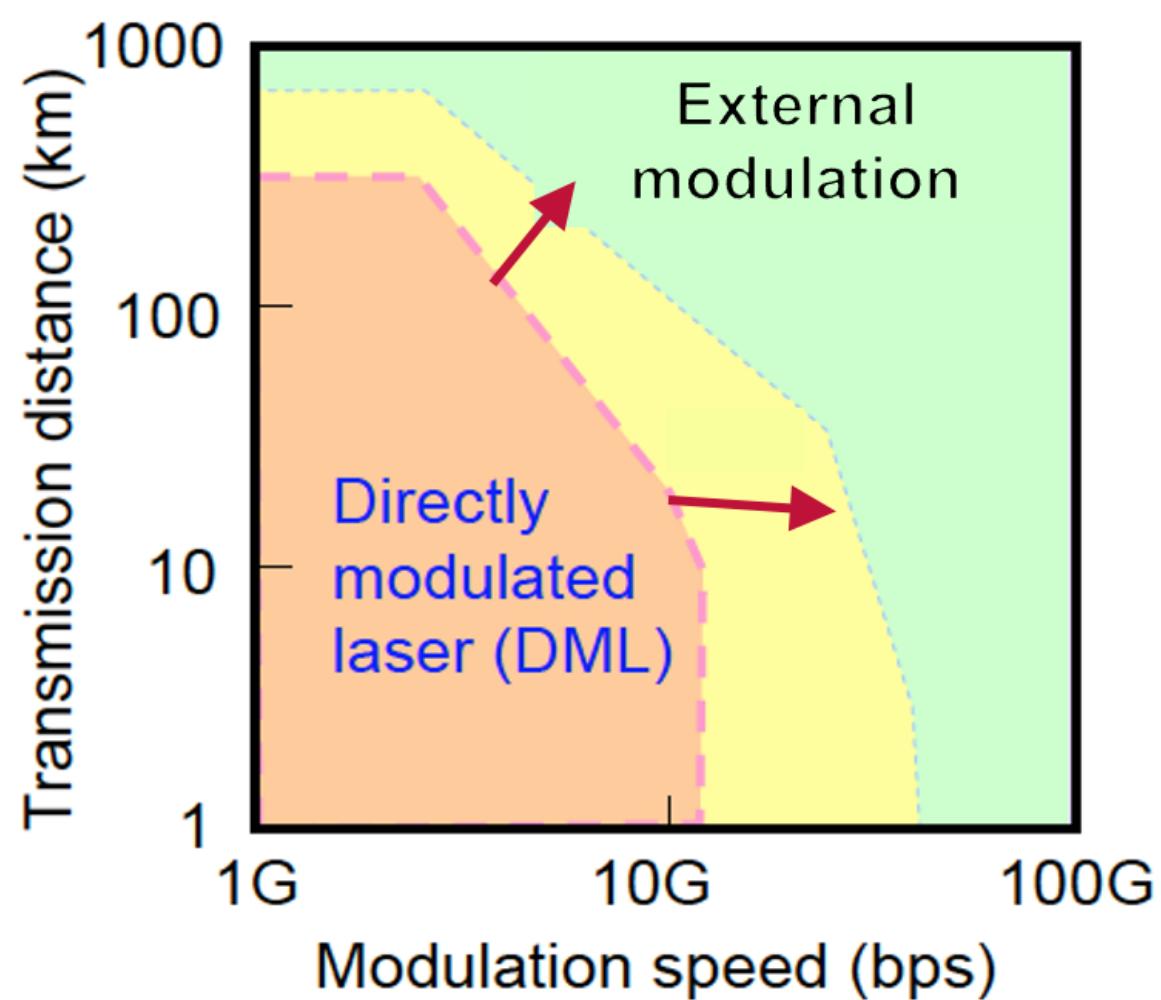
To reduce the global energy consumption, data centers with energy efficient optical components and using renewable energies is required



# Speed & range limitations

Tradeoff between the modulation speed and the transmission distance

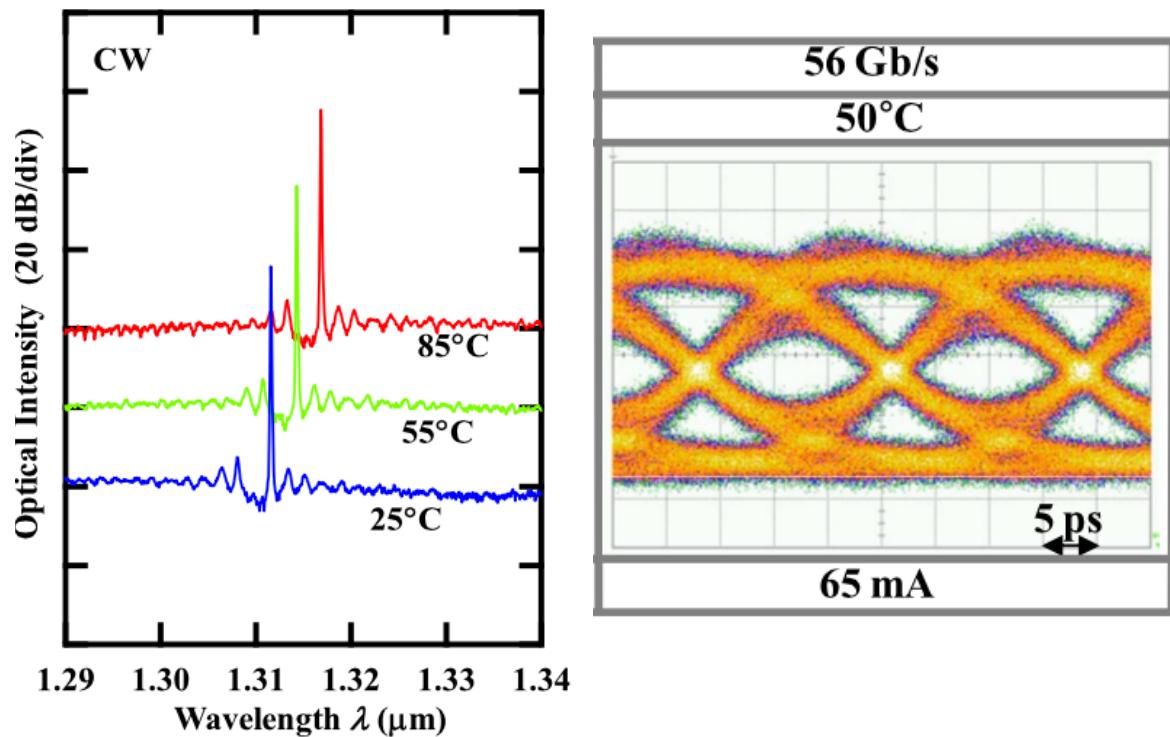
Beyond a certain range, external modulation is mandatory (core networks)



# High-speed lasers

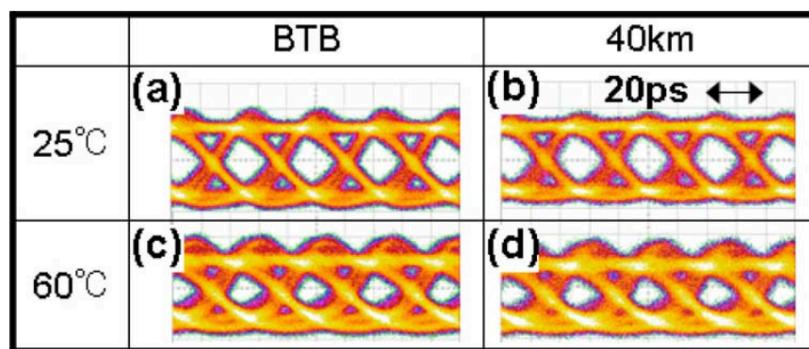
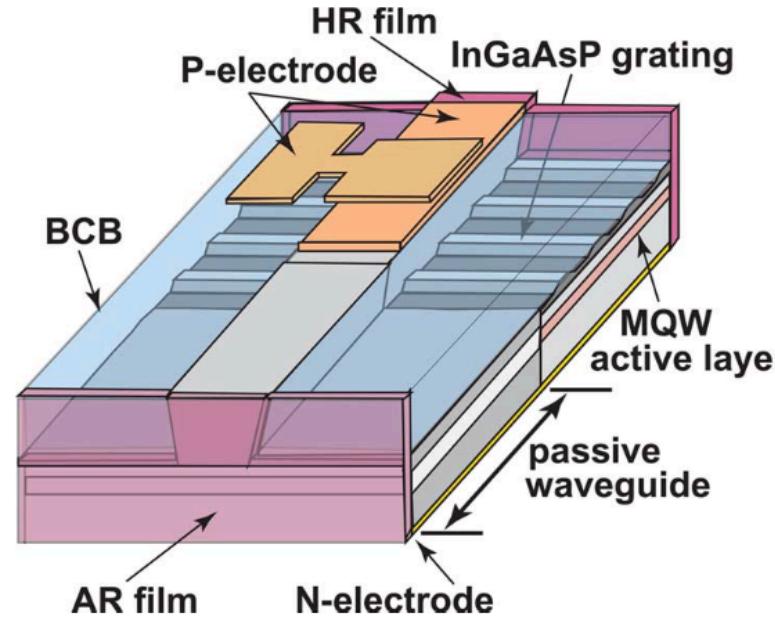


OCLARO   
**HITACHI**



Direct modulation@56 and 50 Gb/s w/ 1.3- $\mu\text{m}$   
InGaAlAs DFB lasers  
Transmission over a 10 km SMF

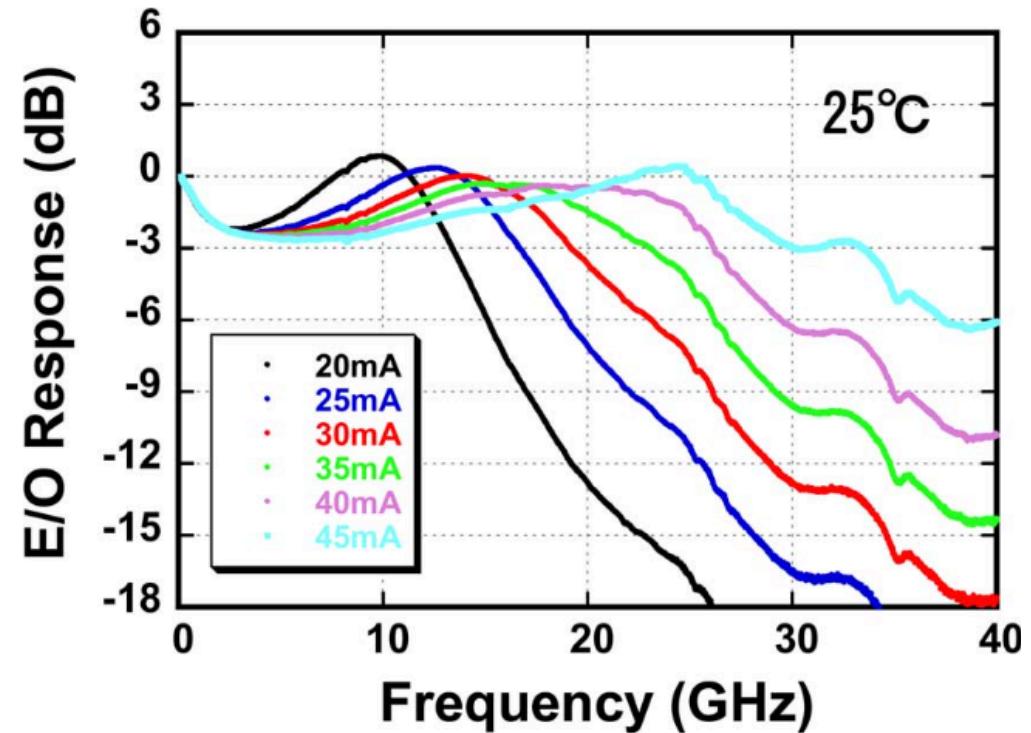
# High-speed lasers



1.3- $\mu\text{m}$  InGaAlAs DFB lasers

3-dB bandwidth of 30 GHz

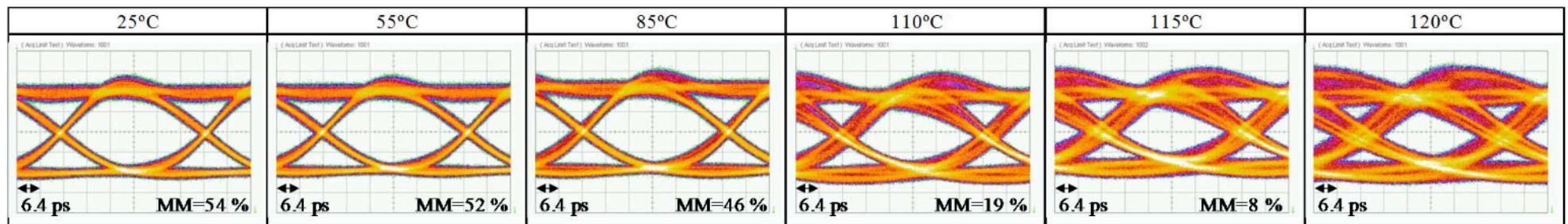
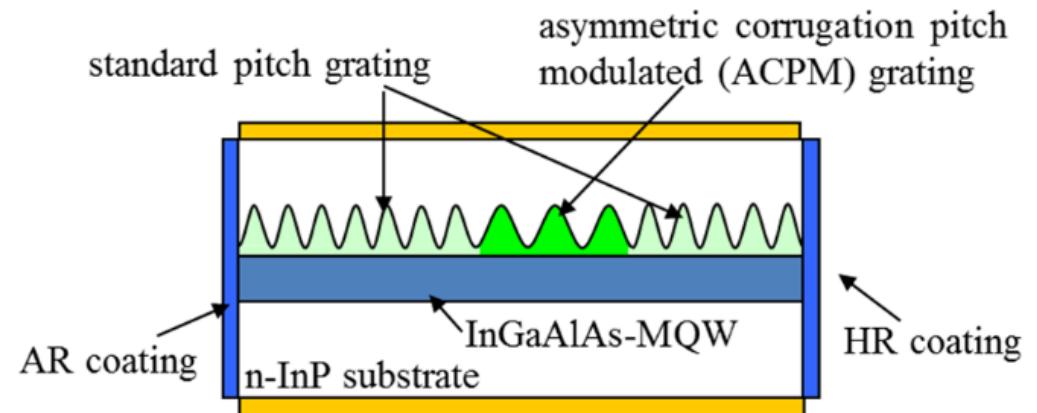
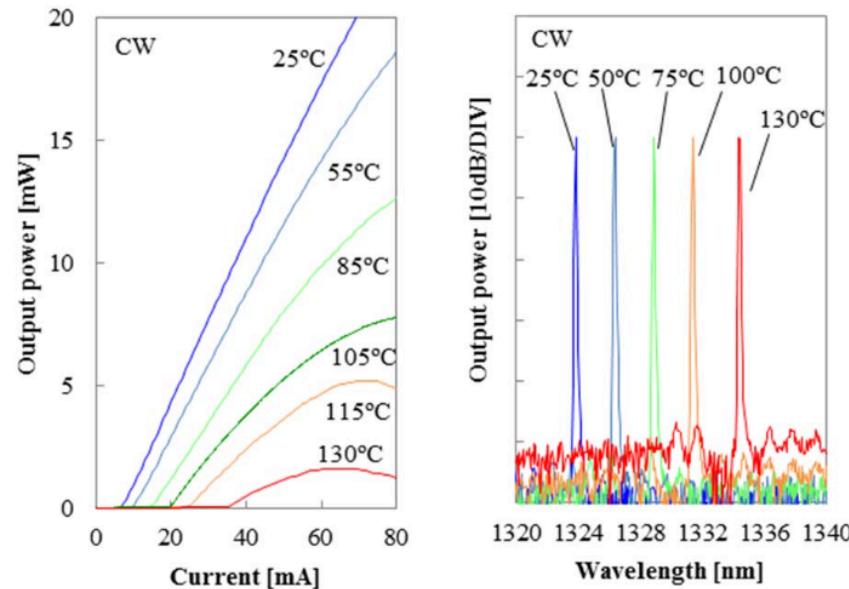
Clear eye @43 Gb/s after 40 km SMF transmission under direct modulation



T. Tadokoro, IEEE J. of Lightwave Technology, vol. 30, pp. 2520-2524, (2012)

# High-speed lasers

High-temperature 25.8-Gbps clear-eye-opening of a 1.3- $\mu\text{m}$  directly modulated InGaAlAs-MQW DFB laser up to 120°C

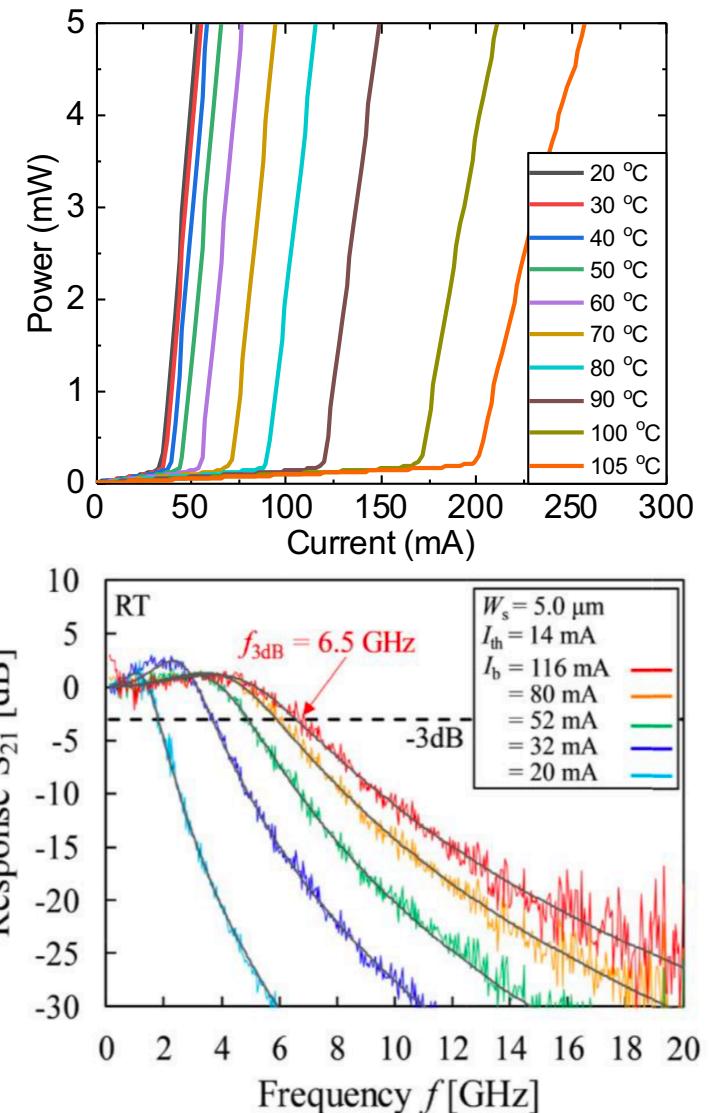
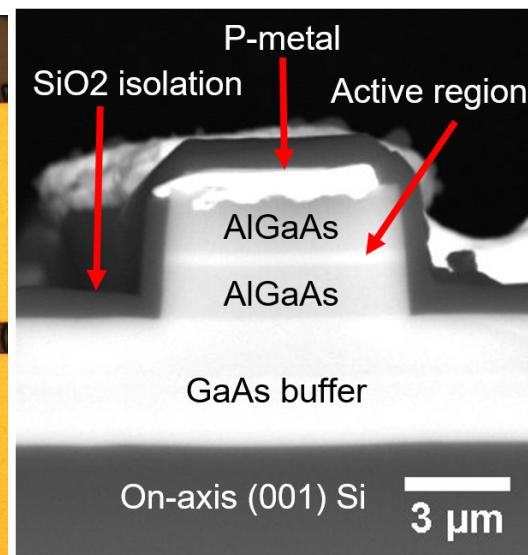


A. Nakanishi et al. , IEEE International Semiconductor Laser Conference, paper WA3, (2016)

# High-speed lasers

## High performance lasers on silicon

- Low dislocation density
- CW threshold current of ~5 mA
- Wall plug efficiency of ~40%
- Single-facet output power 176 mW
- Continuous wave operation >100°C

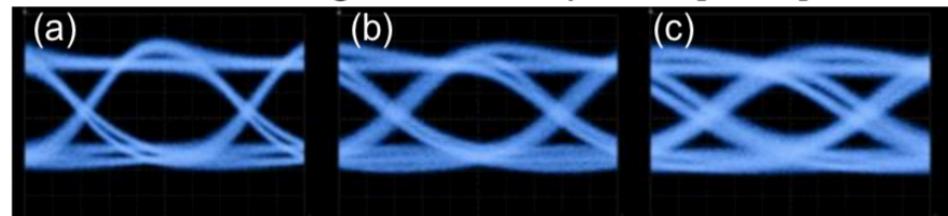
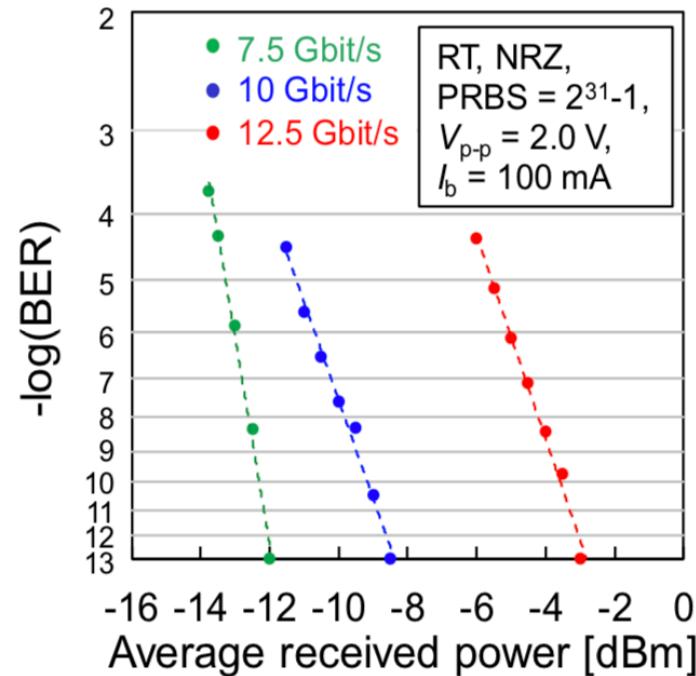


J. Norman et al. APL Photonics (2018)

# High-speed lasers

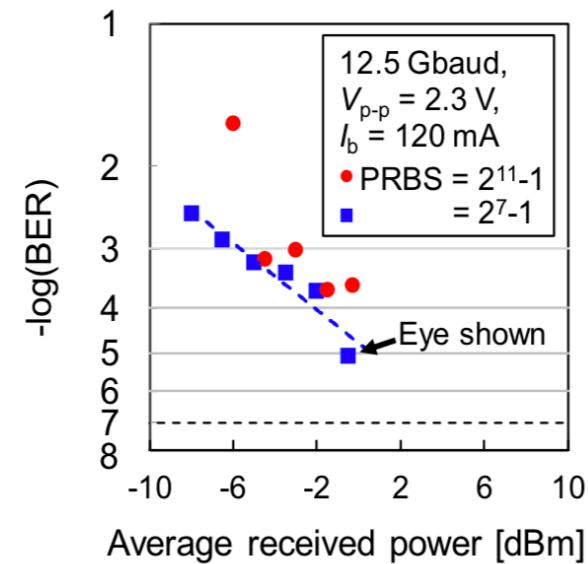
## High performance lasers on silicon

### OOK

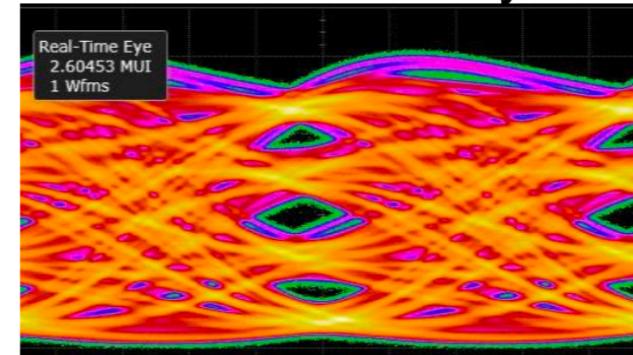


J. Norman et al. ECOC (2018)

### PAM4

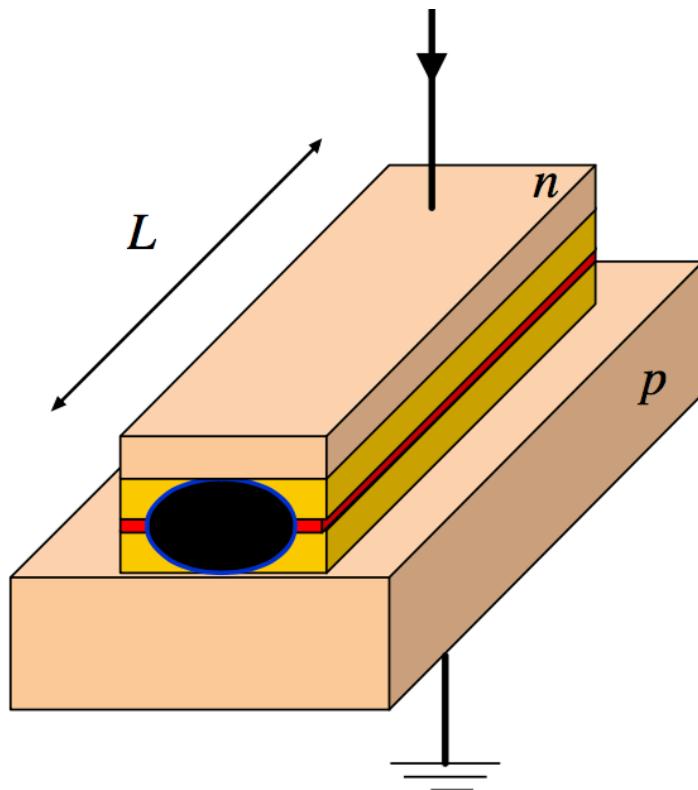


12.5 Gbaud PRBS7 eye

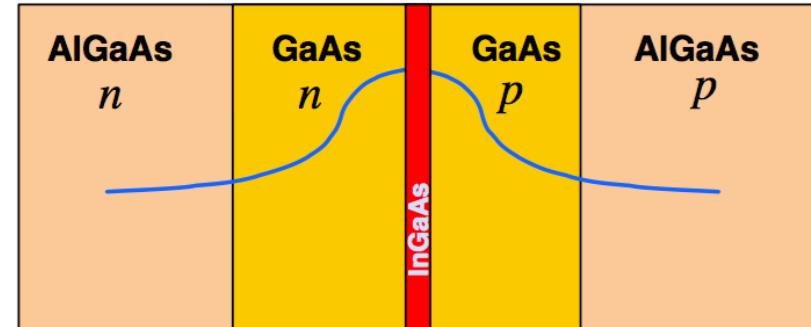


# Semiconductor lasers

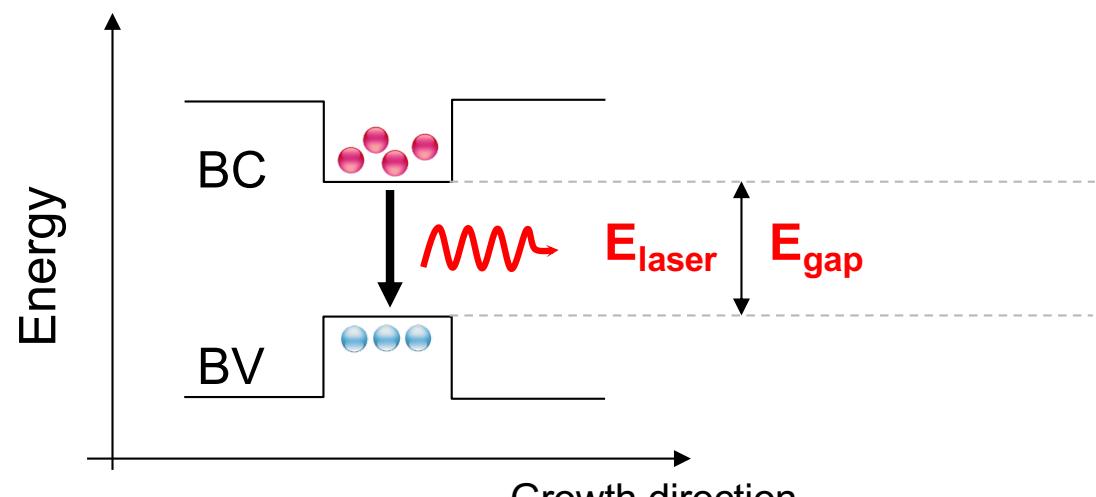
3 equivalent aspects



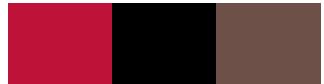
Technology



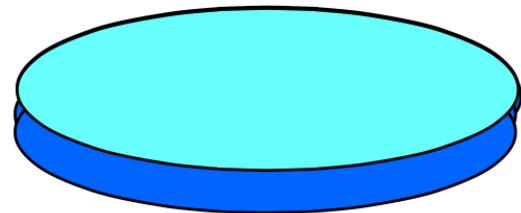
Electromagnetism



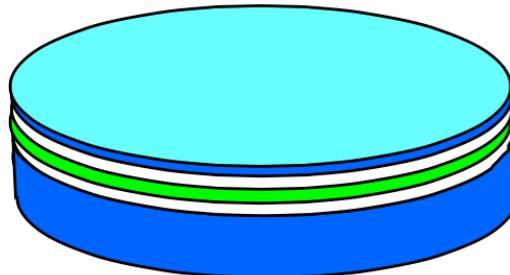
Interband structure



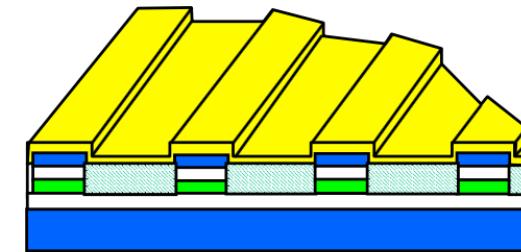
# *Technology & processing*



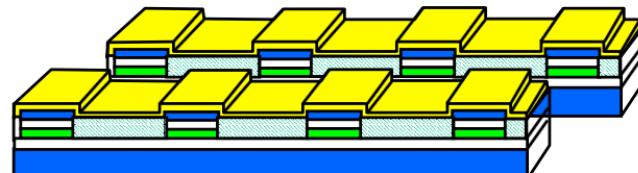
1- SUBSTRATE



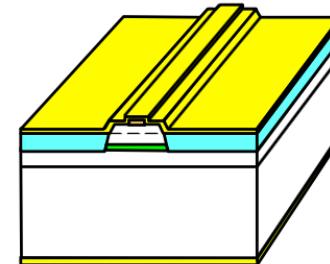
2- EPITAXIE



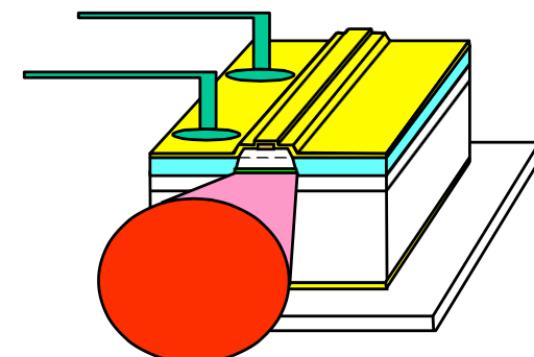
3- LASER PROCESSING



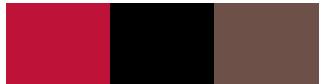
4- FACETS CLEAVING



5- SINGLE CHIP  
PREPARATION

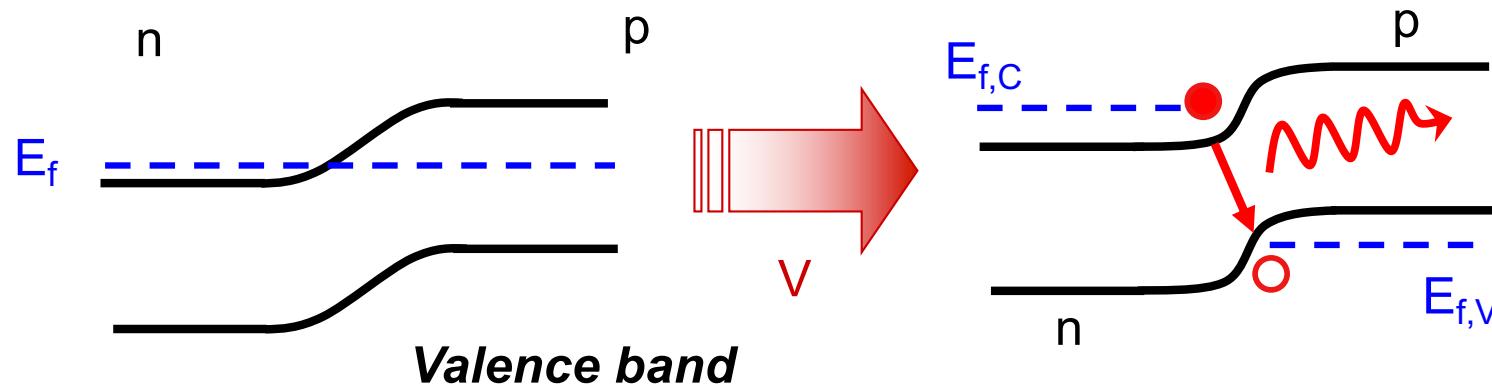


6- MOUNTING, BONDING



# Building block: pn junction

**Conduction band**



**Thermal equilibrium**

$N$  = carrier density  $\rightarrow$  optical gain

$J$  = current density

$\tau_s$  = carrier recombination

$d$  = width of the active zone

**Out of equilibrium**

$$N = \frac{J\tau_s}{qd}$$

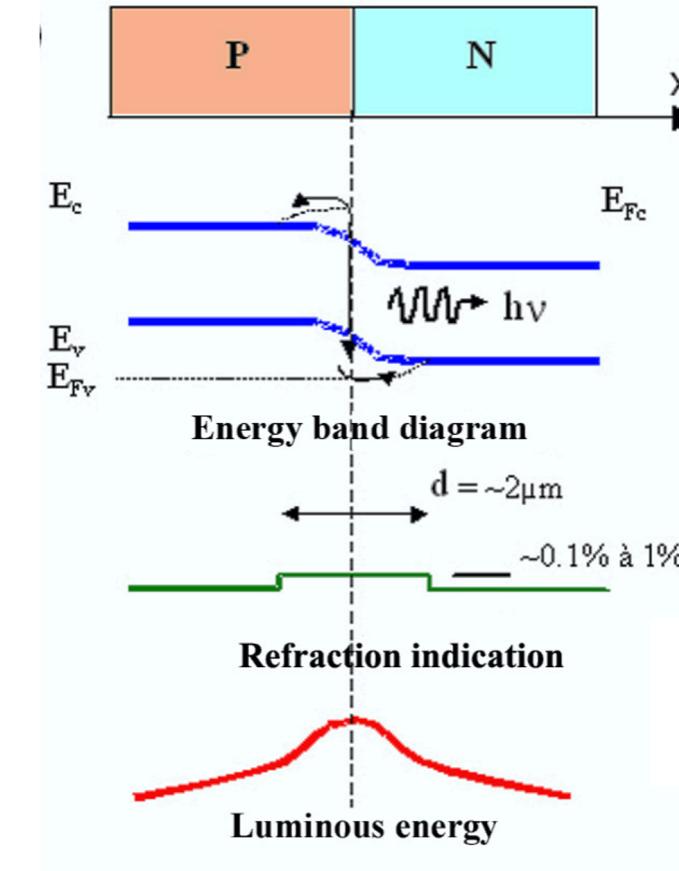
# Homojunction laser

## ■ Homojunction laser

If  $J \uparrow$  then  $N \uparrow$

$N$  must be large so that gain and loss balance each other

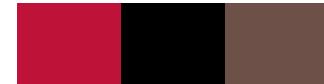
$$N = \frac{J\tau_s}{qd}$$



## In practice

As  $J$  is very large → Power dissipation is critical → Strong thermal issues

Only operates at cryogenic temperatures and under pulsed current  
→ can not be used in a real communication system

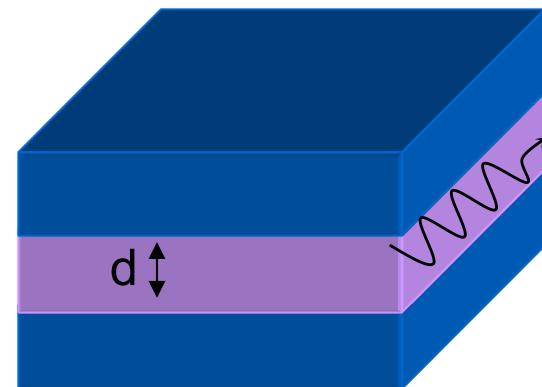


# Double Heterostructure

## ■ Double heterostructure

$$N = \frac{J\tau_s}{qd}$$

Gain  $\nearrow$   
means  $\downarrow d$

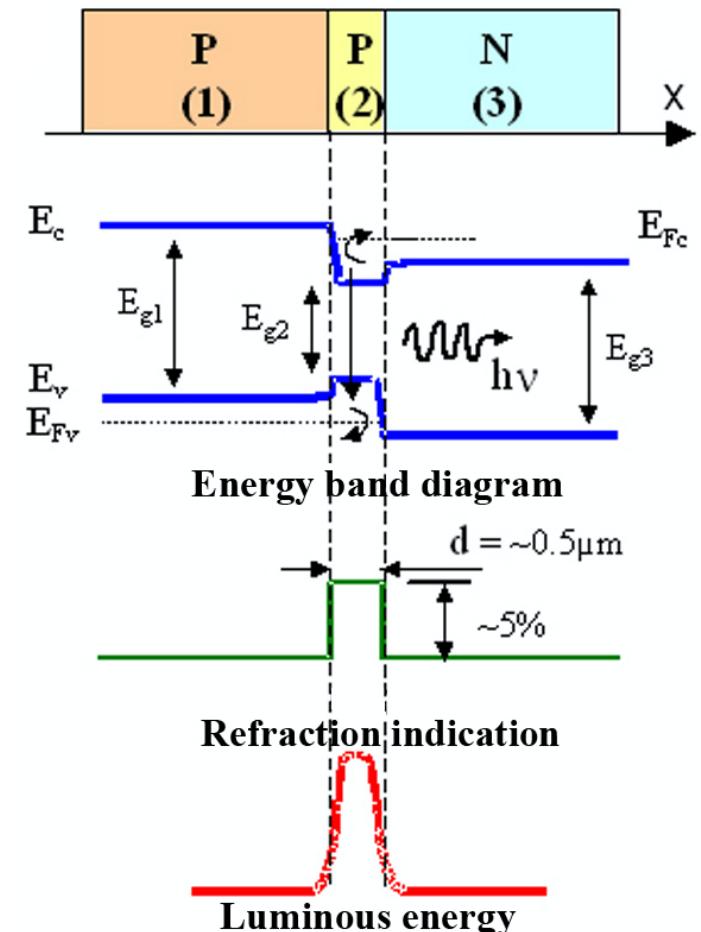


Wide gap  
Small gap  
Wide gap

$n_{\text{small gap}} > n_{\text{wide gap}}$   
Photons are guided !

$d < 500 \text{ nm}$  against  $\sim 1 \mu\text{m}$  for a pn junction  
Threshold decreased by one order of magnitude

1970: continuous-waves room temperature demonstrated!

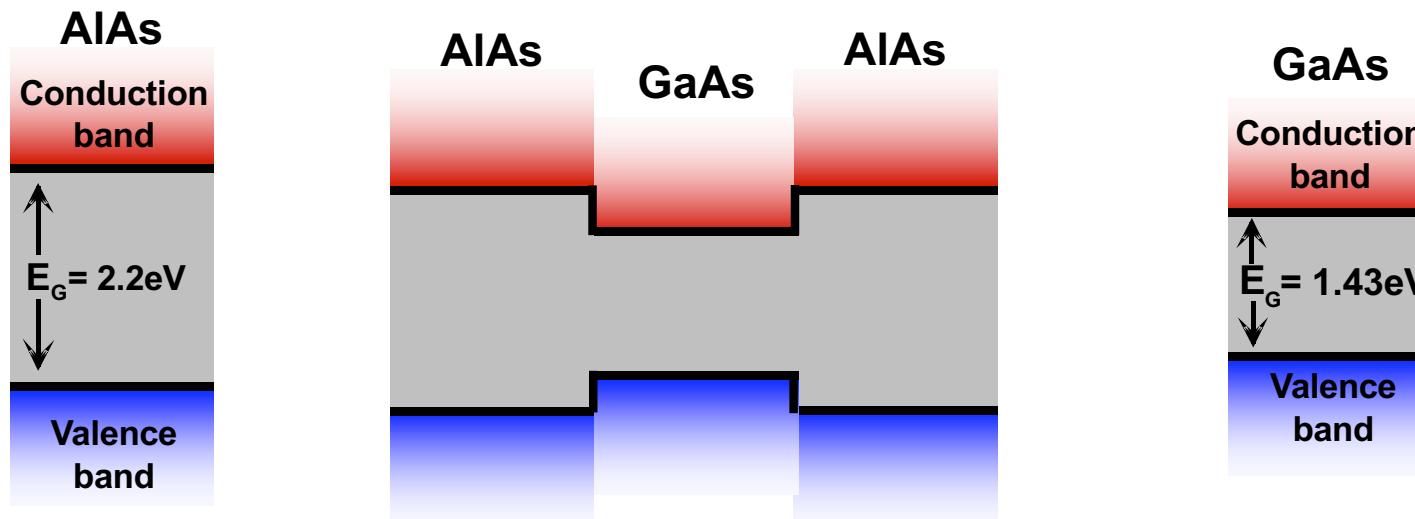


# *Building block: quantum well*

Principle: stick two different semiconductor materials

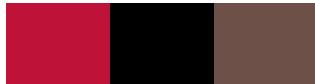
The lattice parameters must be compatible!

Example :  $\text{GaAs} = \text{AlAs} = 5.63\text{\AA}$



Quantum well  
Small size double  
heterostructure (nm)

The quantum well is the  
building block of the  
quantum technologies

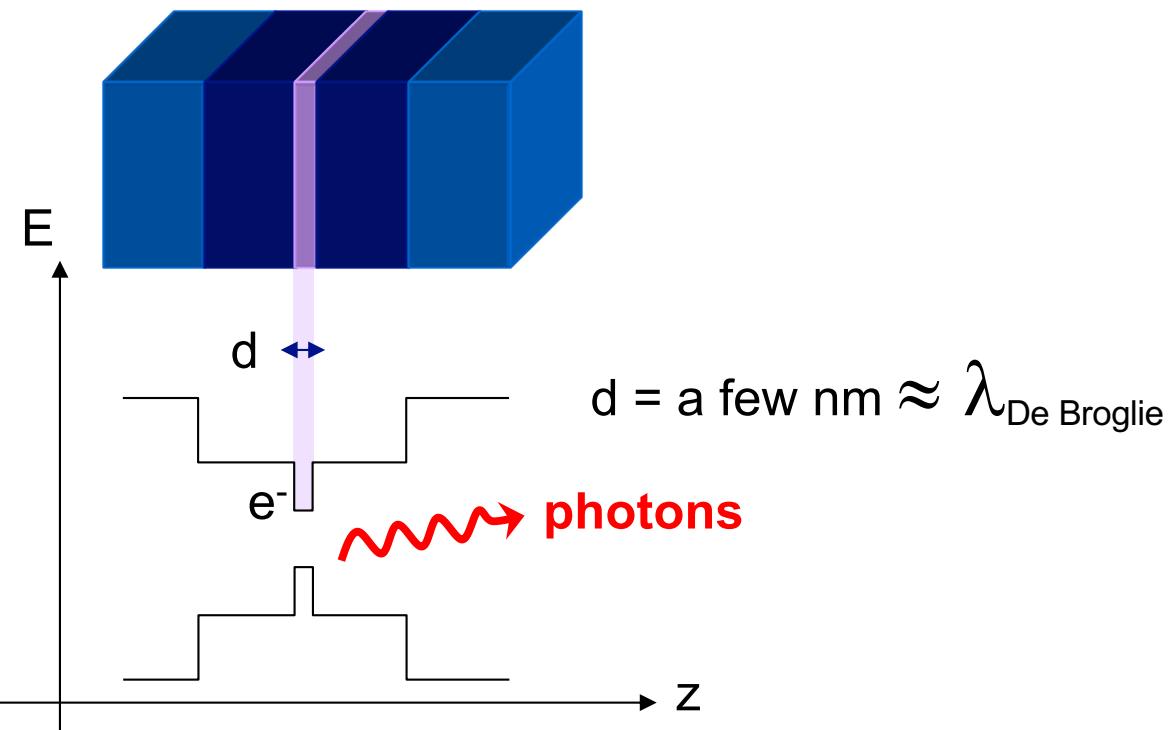


# Quantum well technology

What is the optimal value for “d”?

Gain: the smaller “d”, the better!

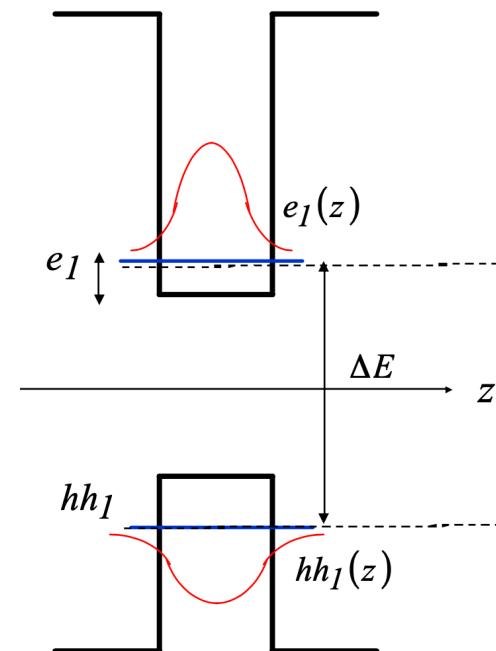
Guiding : If  $d \sim \lambda$  diffraction problem !

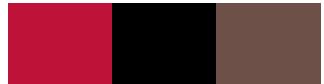


→ diode lasers with enhanced performance e.g., large output power, high-temperature operation, very long lifetime,...

Schrödinger's equation for  $e_1$

$$-\frac{\hbar^2}{2m_c} \frac{d^2}{dz^2} e_1(z) + V(z)e_1(z) = e_1 \cdot e_1(z)$$



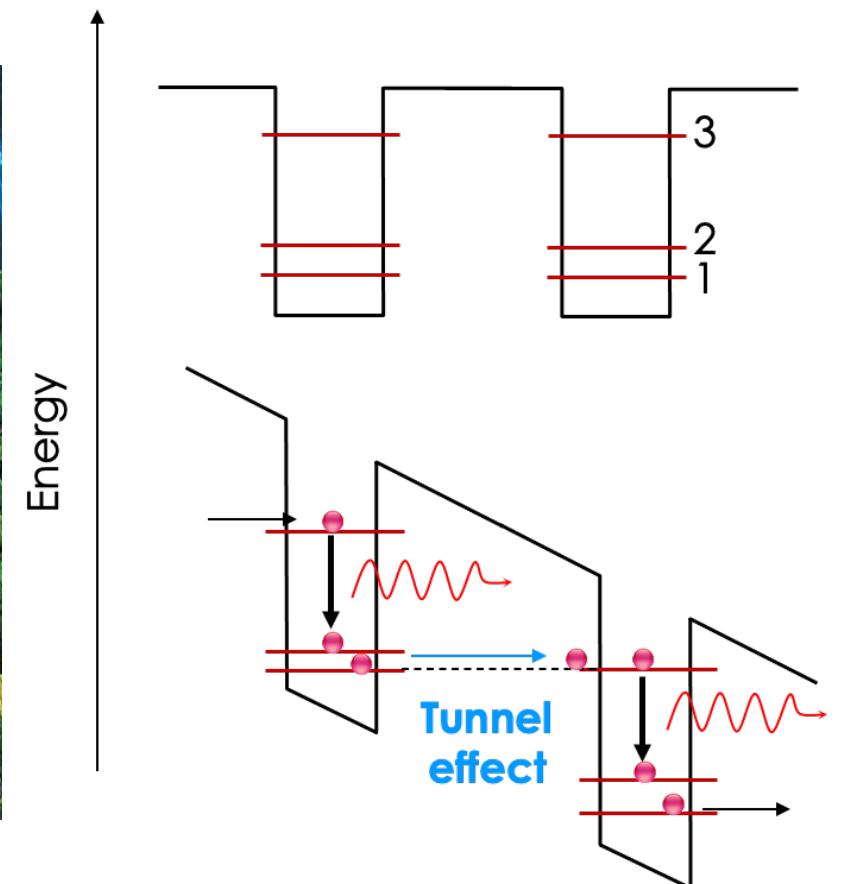
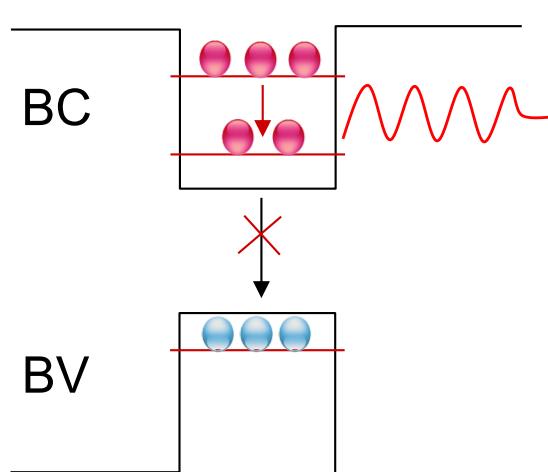


# Quantum cascade lasers

Greatly tunable from 3 to 300 microns optical wavelength

Short carrier lifetime (intersubband process with picosecond transitions)

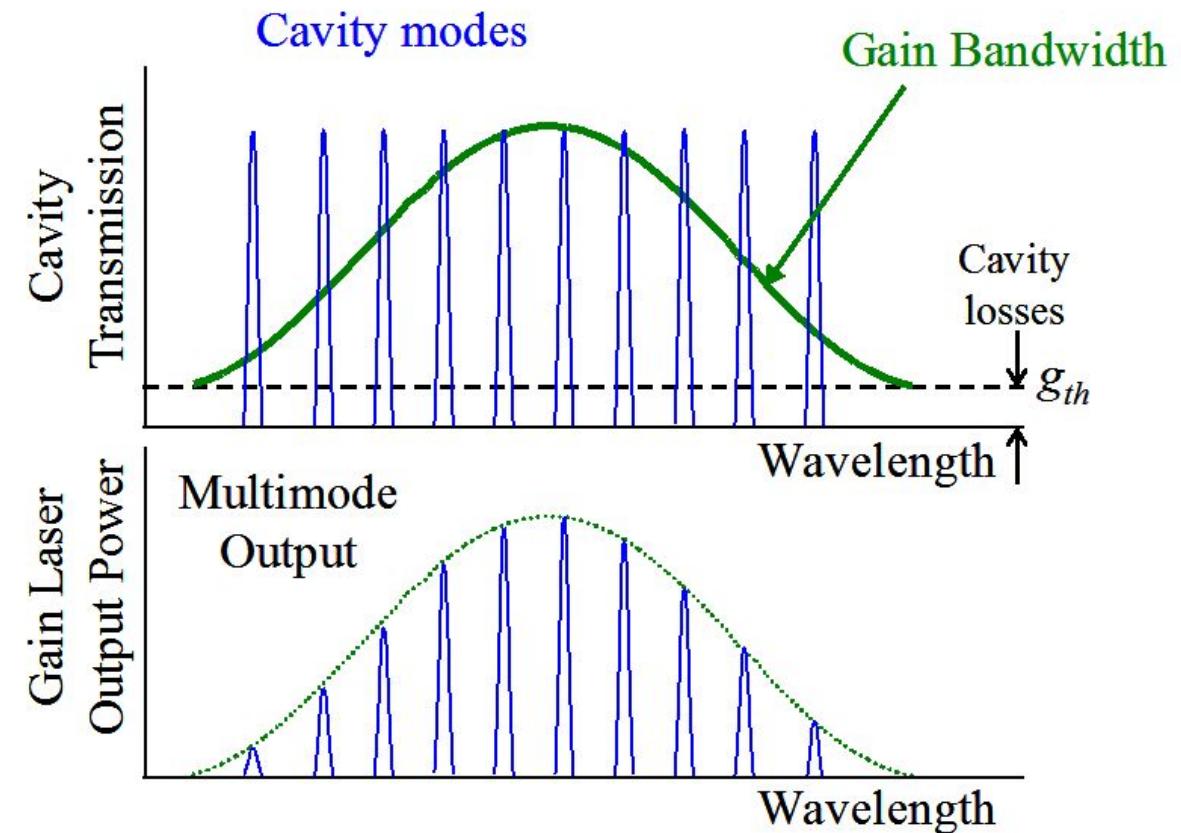
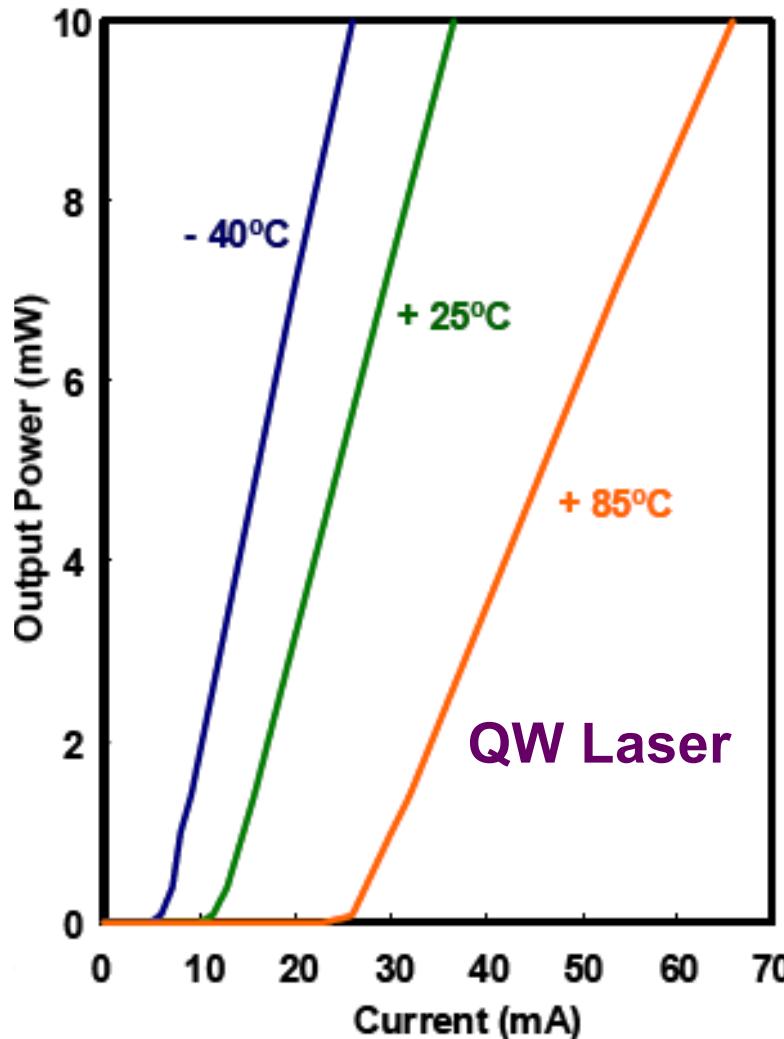
Unipolar: only electrons are involved



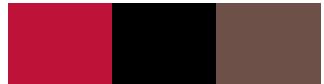
Applications : free-space communications, spectroscopy

# *Light current characteristics*

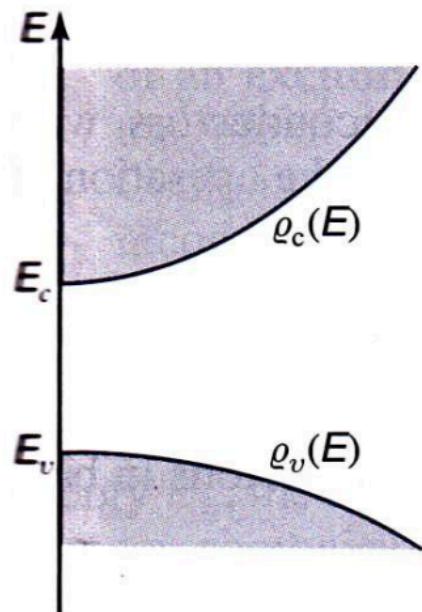
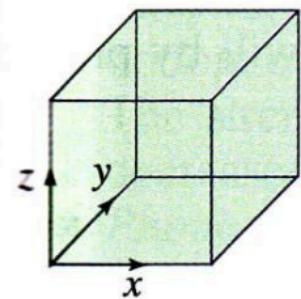
## *Emission properties*



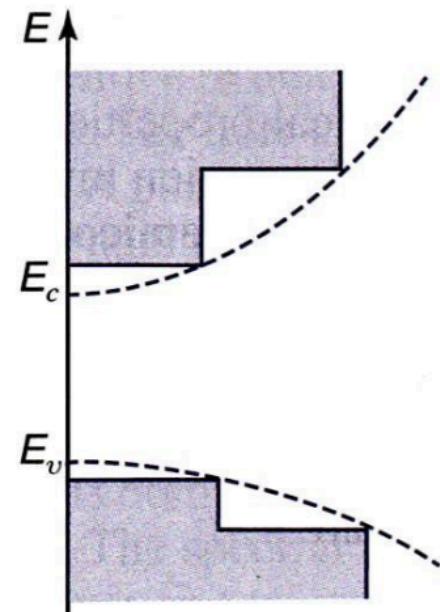
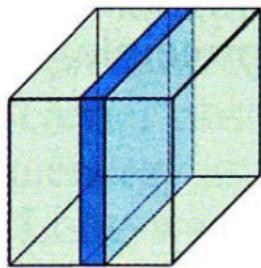
Multimode operation → Fabry-Perot lasers



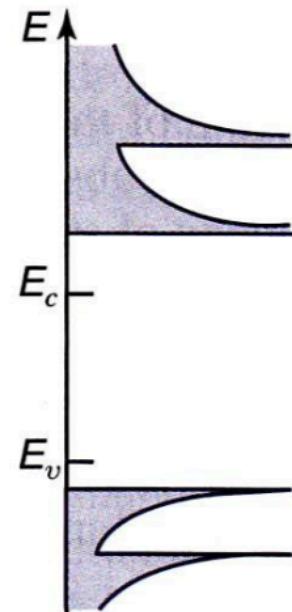
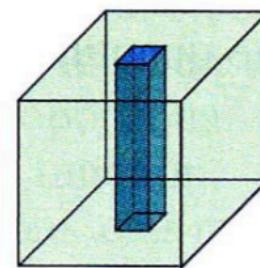
# Low dimensional quantum systems



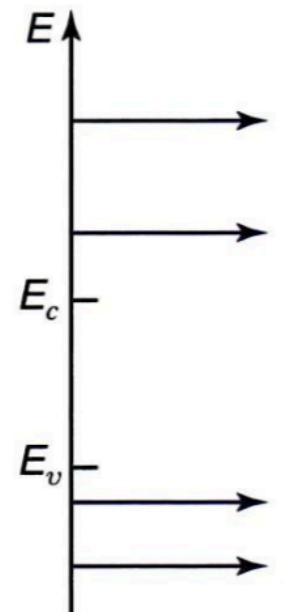
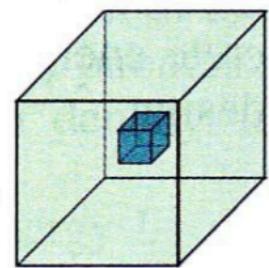
Bulk



Quantum well



Quantum wire

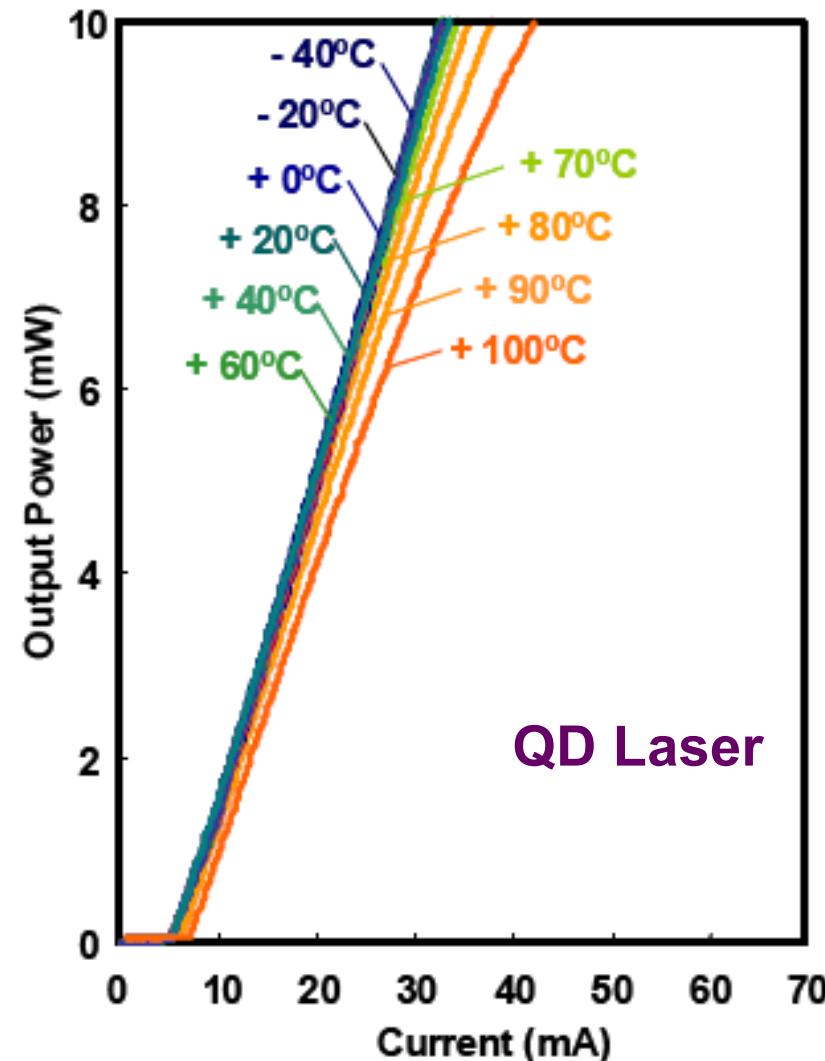
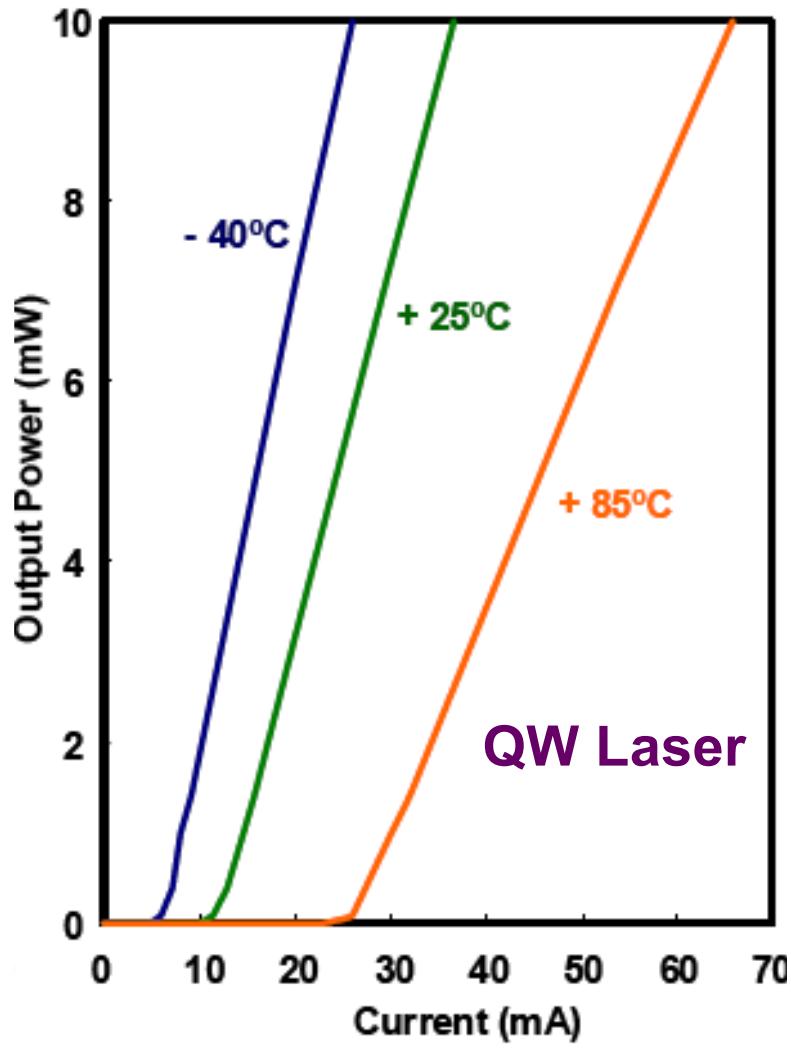


Quantum dot



# *Light current characteristics*

## *Emission properties*

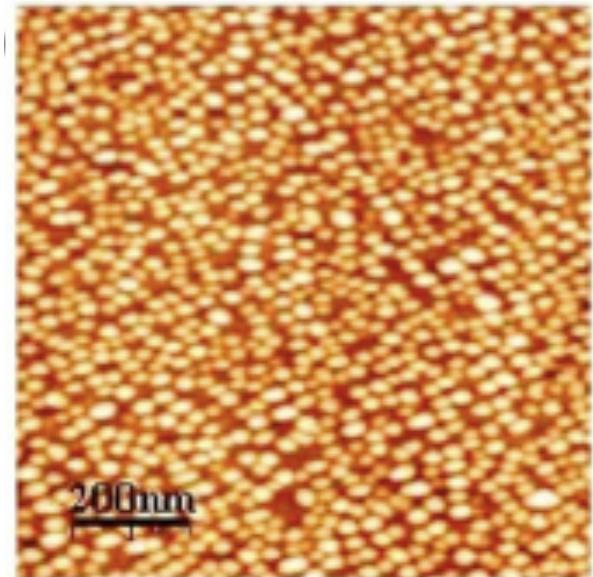




# *Quantum dot lasers*



InAs QDs

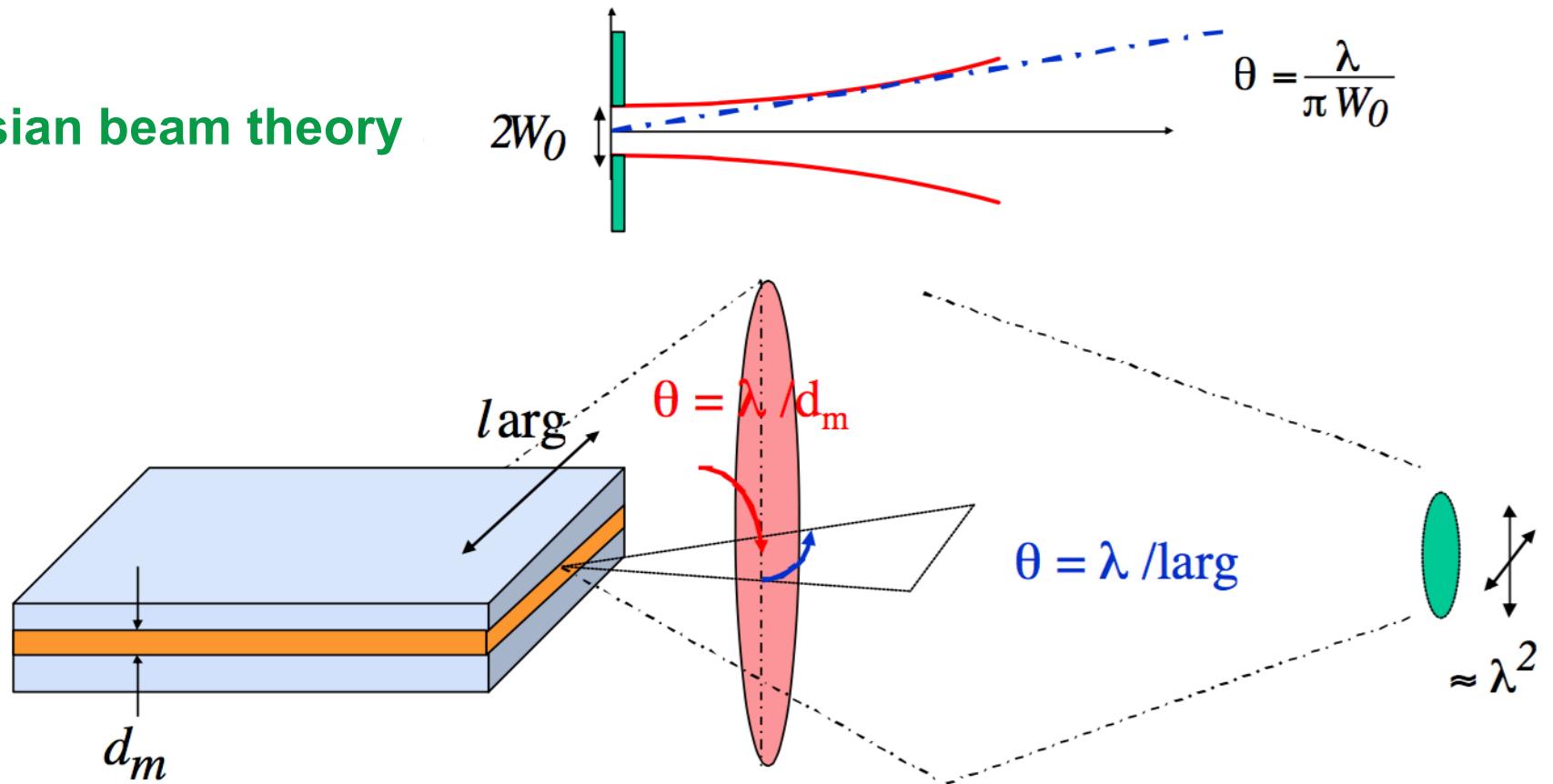


→ Electrons, holes are confined in a tiny structure, so the carriers can hardly move, even at elevated temperatures



# Emissivity

Gaussian beam theory



Anisotropic divergence  $\rightarrow$  anamorphosis optics



# Single-mode laser (DFB)

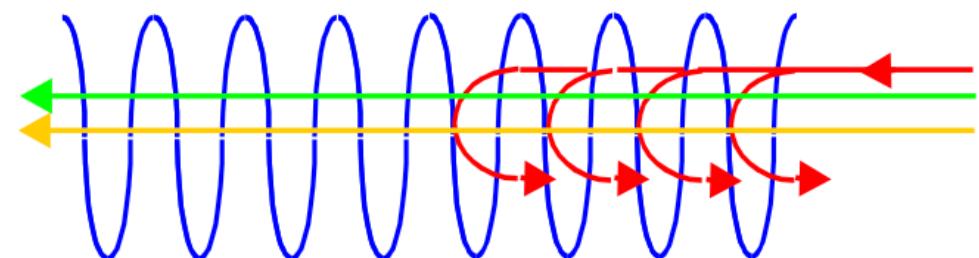
Periodic perturbations of the refractive index along the laser cavity provide the frequency-selective feedback

DFB lasers are designed to experience internal feedback all along the gain ridge → no end mirrors are needed

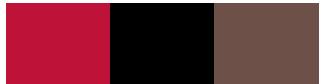
*Fabry-Perot  
Localized reflection  
 $\lambda$ -independent  
Many modes*



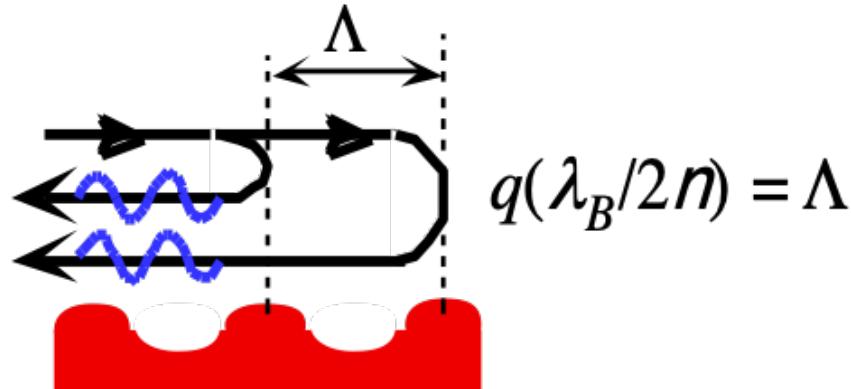
*Distributed feedback  
Distributed reflection  
 $\lambda$ -dependent  
Phase  $\pi/2$   
2 or 1 modes*



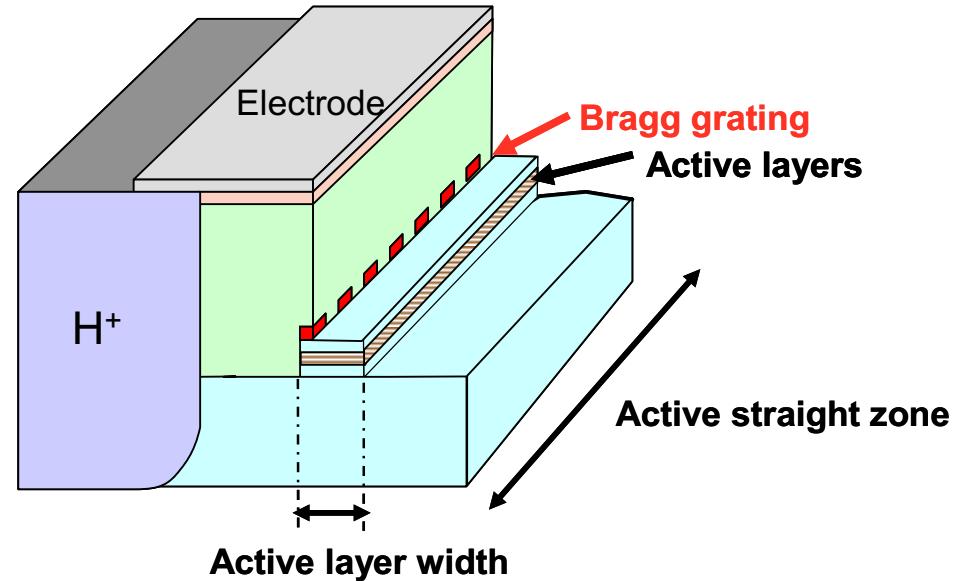
H. Kogelnik and C. V. Shank, J. Appl. Phys. 43 (5), 2327 (1972)



# Single-mode laser (DFB)

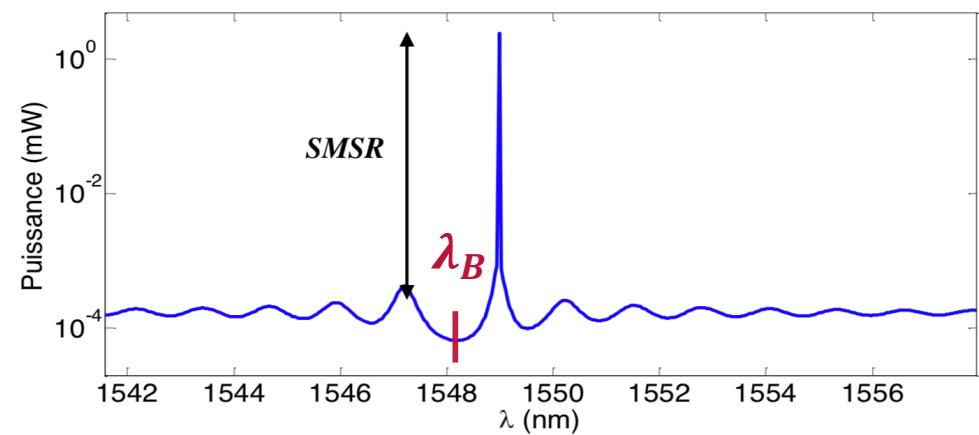


$$q(\lambda_B/2n) = \Lambda$$



Active zone

InAsP QWs	QW Width	Barrier Width	QW Strain	Barrier strain
9	8 nm	8 nm	+1%	-0.6%

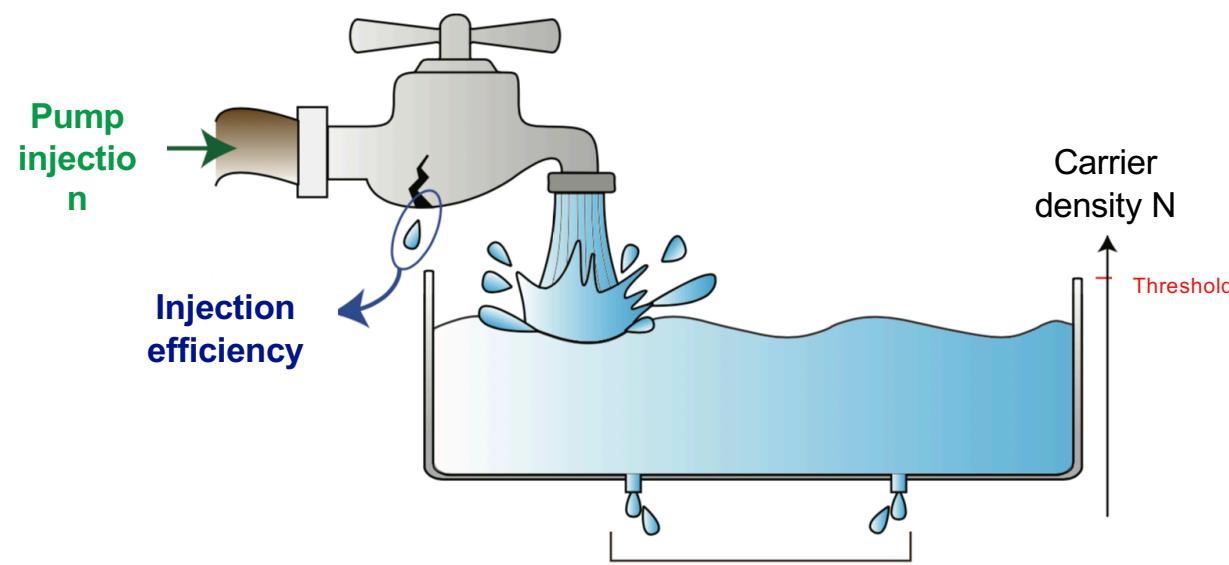


# Corpuscular equations

$$E(t) = \sqrt{S(t)} e^{-j\phi(t)}$$

$$S = |E|^2$$

Complex field



Carrier reservoir

$$\frac{dN}{dt} = \frac{I}{qV} - \frac{N}{\tau_c} - G_N(N - N_t)S$$

$$\frac{dS}{dt} = G_N(N - N_t)S - \frac{S}{\tau_p}$$

Photon reservoir

$$\frac{d\phi}{dt} = \frac{\alpha_h}{2} G_N(N - N_t)$$

Phase

L. A Coldren, S. W Corzine. Diode lasers and photonic integrated circuits, John Wiley & Sons, 2012.



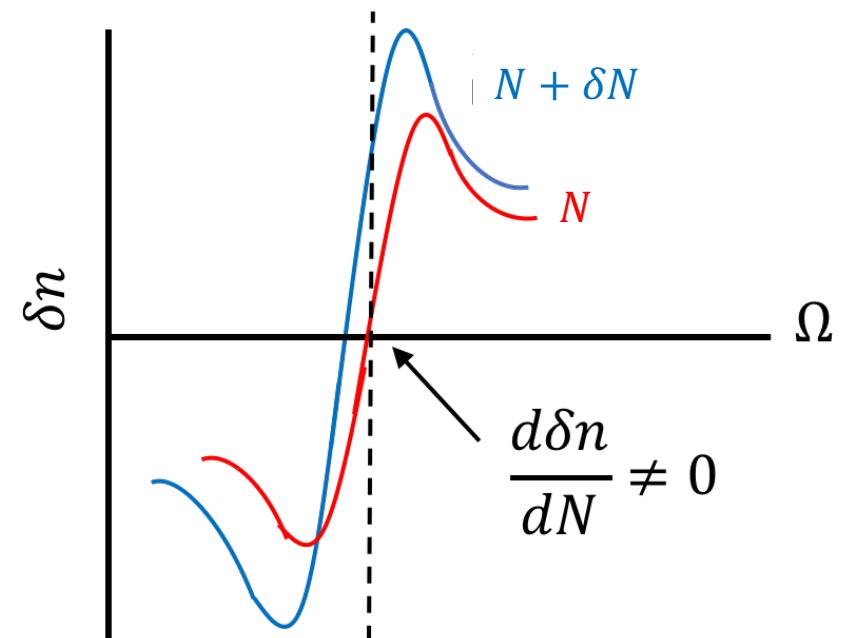
# Linewidth broadening factor

Frequency pulling → Change of the refractive index →  $\alpha_H$  factor

$$\alpha_H = -\frac{4\pi}{\lambda} \frac{\delta n}{\delta G}$$

Variations of the carrier density modulates the gain and the optical index causing the resonant mode to shift

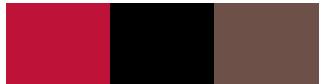
$$\delta\nu = \frac{\alpha_H}{4\pi} G_N v_g \delta N$$



chirp of the cold cavity

Additional frequency chirping induced by the modulation (see later on)

F. Grillot et al. , IEEE Journal of Quantum Electronics, Vol. 44, pp. 946-951, 2008



# Clamping & saturation

$$\frac{dN}{dt} = \frac{I}{qV} - \frac{N}{\tau_c} - G_N(N - N_t)S$$
$$\frac{dS}{dt} = G_N(N - N_t)S - \frac{S}{\tau_p}$$

**Gain (linear approximation)**

$$G(N) = G_N(N - N_t)$$

**Cavity frequency**

$$\omega(N) = \omega_{th} + \omega_N(N - N_{th})$$

**Carrier density at optical transparency**

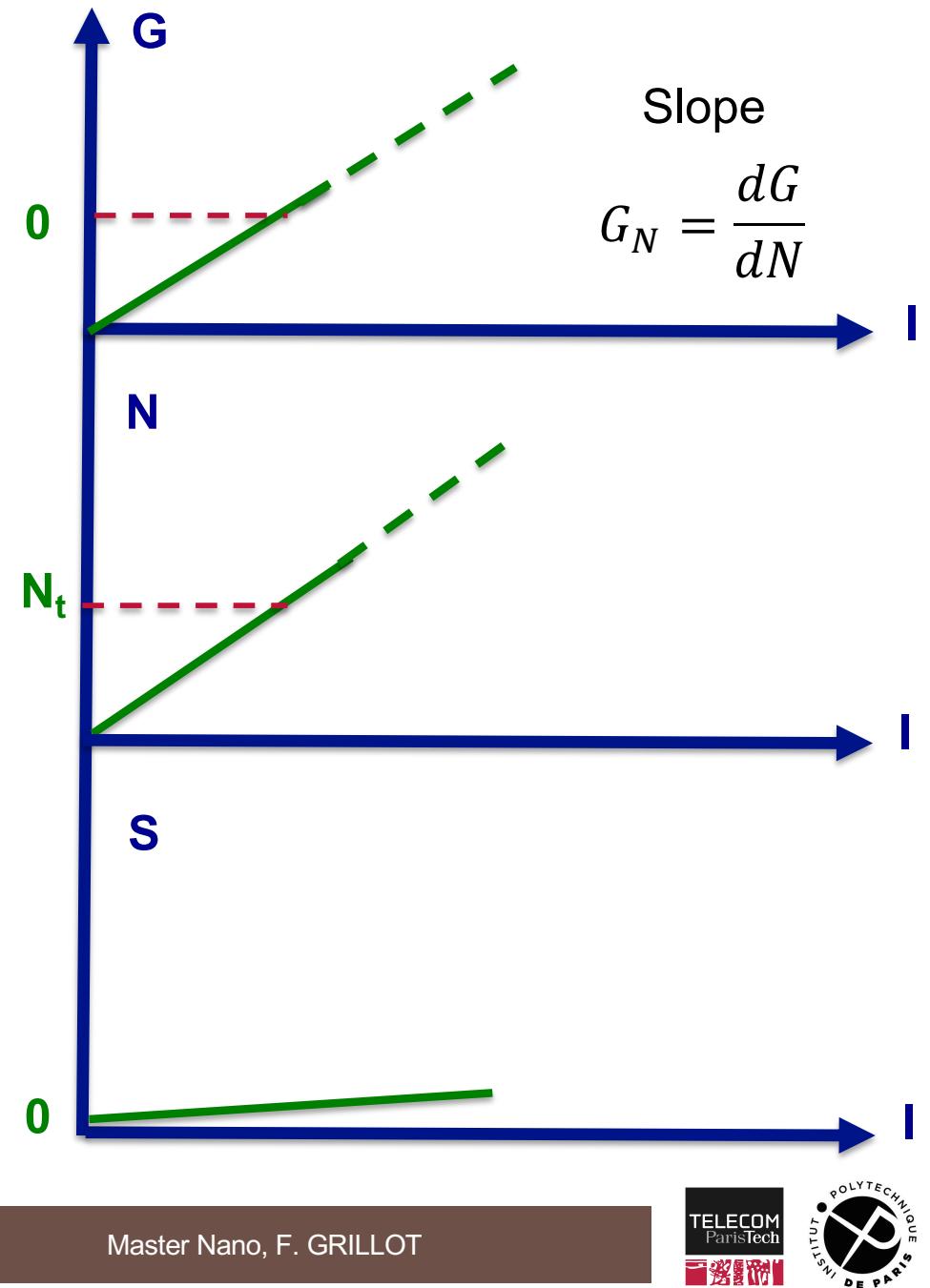
→  $N > N_t$ : luminescence ( $G > 0$ )

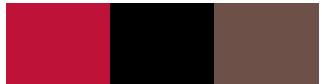
→  $N < N_t$ : absorption ( $G < 0$ )

**Threshold ( $N=N_{th}$ ): carrier clamping**

→ Gain =  $\sum$  Loss

→  $G(N_{th})=G_{th}$





# Clamping & saturation

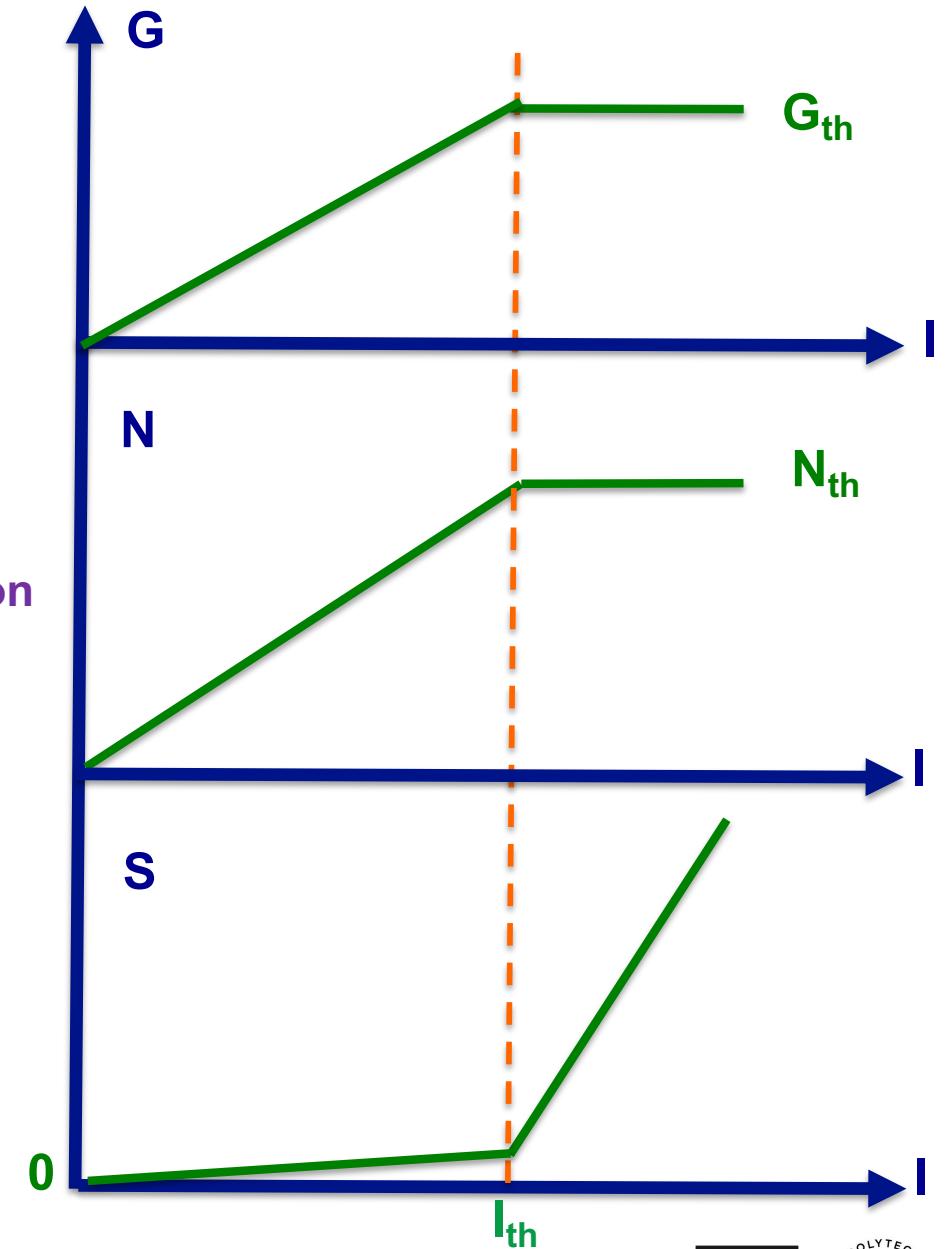
$$\frac{dN}{dt} = \frac{I}{qV} - \frac{N}{\tau_c} - G_N(N - N_t)S$$
$$\frac{dS}{dt} = G_N(N - N_t)S - \frac{S}{\tau_p}$$

Gain saturation

→ Stabilization when stimulated recombination are compensated by the pump

$$N = \frac{N_0}{1 + \frac{S}{S_{sat}}} \rightarrow G = \frac{G_0}{1 + \frac{S}{S_{sat}}}$$

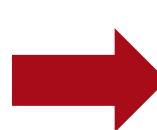
$$N_0 = \frac{I\tau_c}{eV} \quad G_0 = G_N N_0 \quad S_{sat} = \frac{1}{G_N \tau_c}$$



# Relaxation oscillations

$$\begin{aligned}\frac{dN}{dt} &= \frac{I}{qV} - \frac{N}{\tau_c} - G_N(N - N_t)S \\ \frac{dS}{dt} &= G_N(N - N_t)S - \frac{S}{\tau_p}\end{aligned}$$

**Small perturbation of the steady-state**

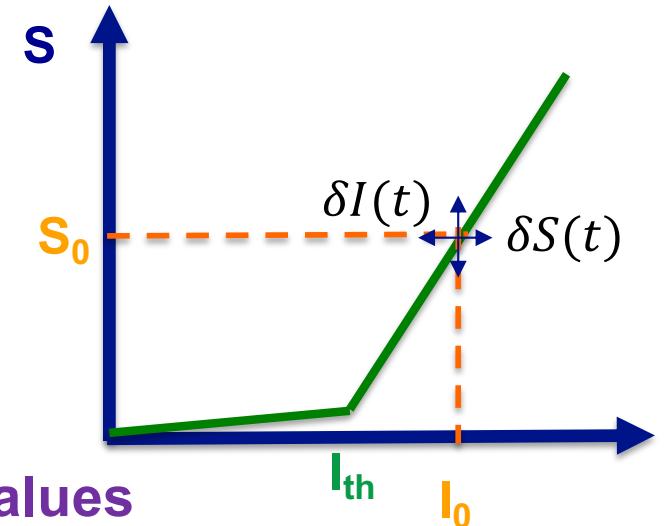


$$N(t) = N_0 + \delta N(t)$$

$$I(t) = I_o + \delta I(t)$$

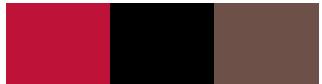
$$S(t) = S_0 + \delta S(t)$$

$$\begin{bmatrix} \dot{\delta N} \\ \dot{\delta S} \end{bmatrix} = \begin{bmatrix} -\frac{1}{\tau_c} - G_N S_0 & -1/\tau_p \\ G_N S_0 & 0 \end{bmatrix} \begin{bmatrix} \delta N \\ \delta S \end{bmatrix}$$

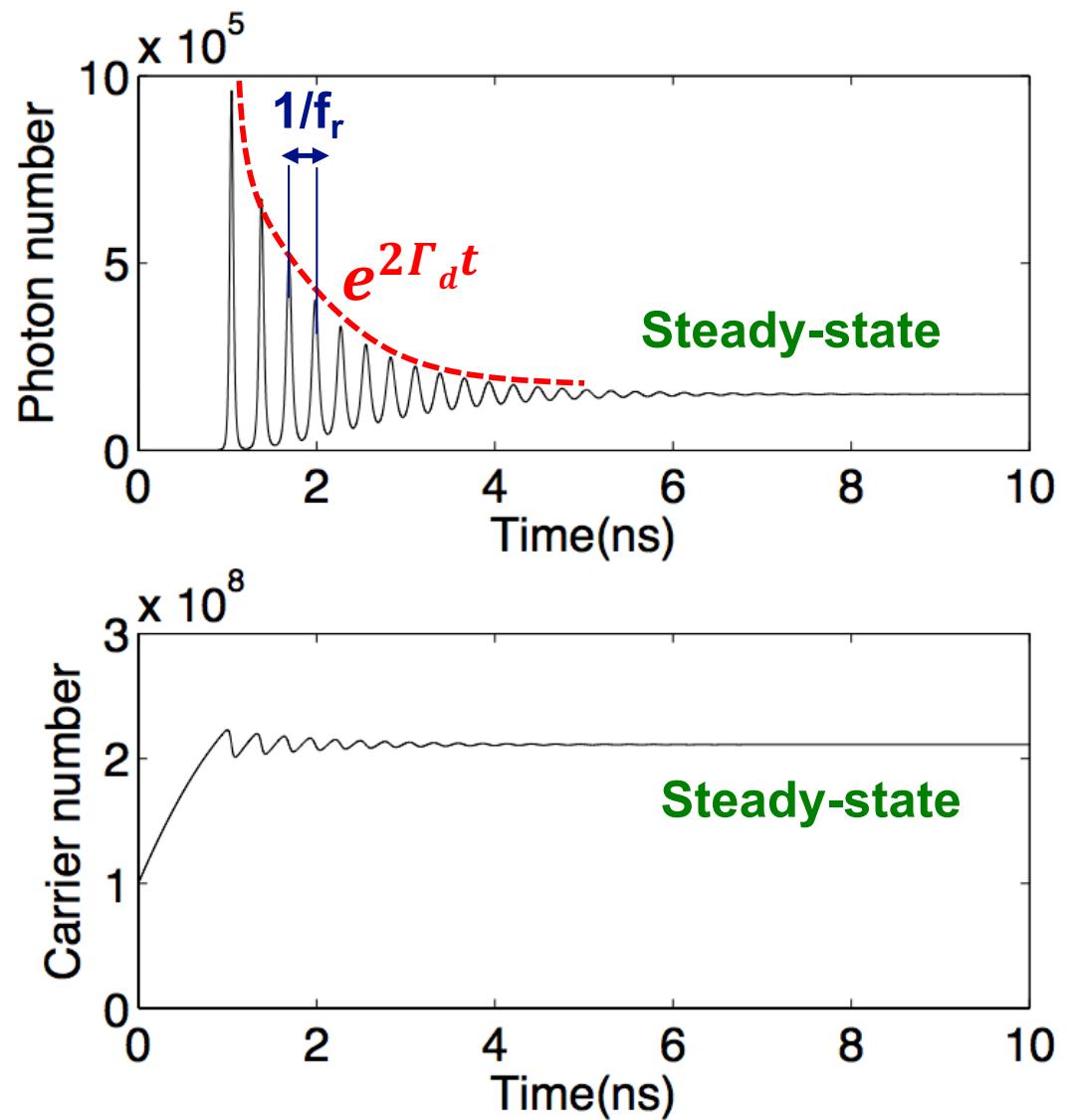
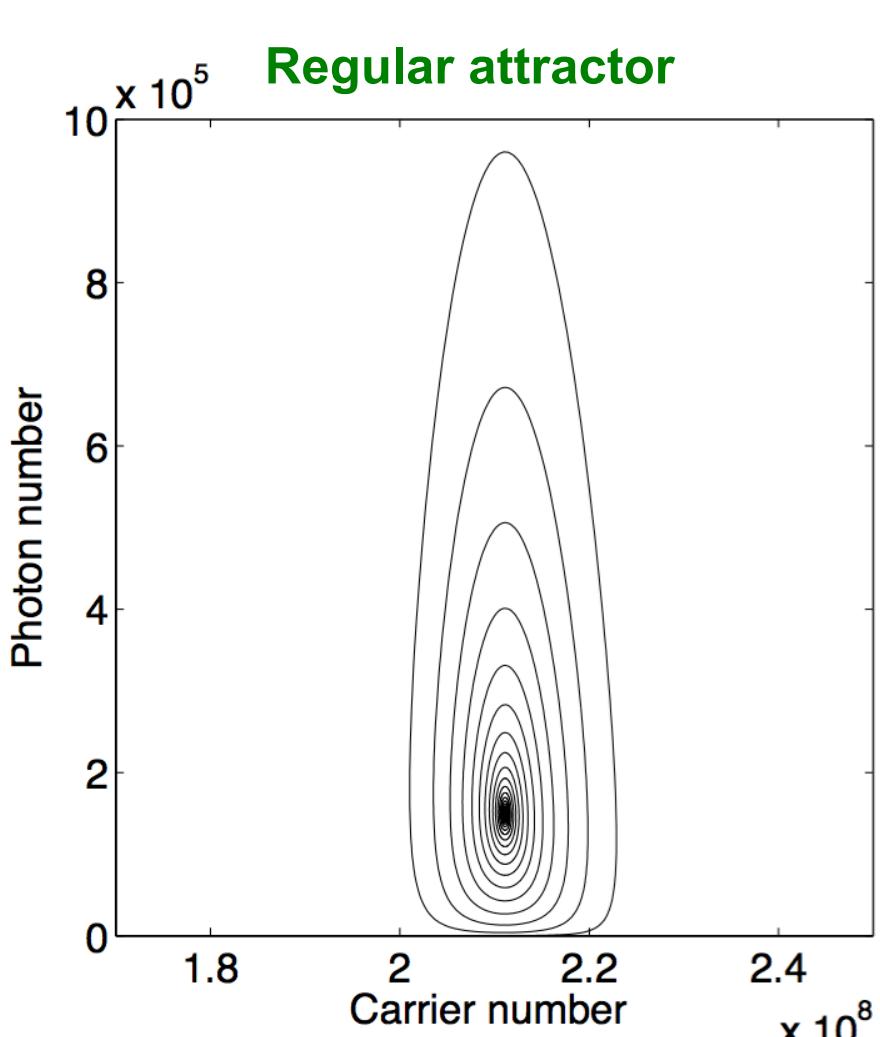


The evolution matrix gives access to the eigenvalues

$$f_{\pm} = -\Gamma_d \pm \sqrt{\Gamma_d^2 - f_r^2} \quad \text{with } \Gamma_d < f_r \text{ for an interband diode laser}$$



# Relaxation oscillations



T. Erneux and P. Glorieux, Laser Dynamics, Cambridge



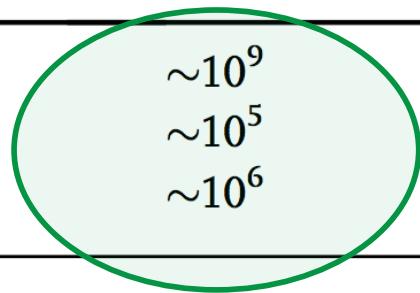
# *Relaxation oscillations*

**Relaxation oscillation: beating between carrier and photon populations**

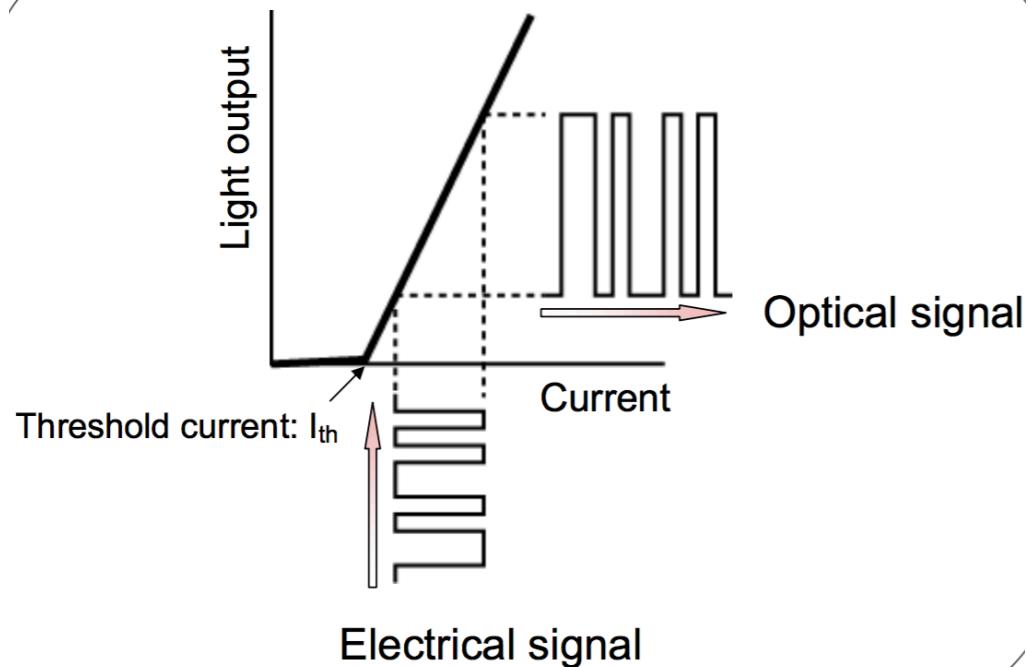
**Semiconductor lasers display very large relaxation frequencies (>GHz) allowing very high-speed modulation**

---

Population lifetime (carrier lifetime) [s]	Photon lifetime [s]	Relaxation oscillation frequency [Hz]
Semiconductor lasers	$10^{-9}$	$10^{-12}$
Solid-state lasers	$10^{-3}$	$10^{-9}$
Gas lasers	$10^{-8}$	$10^{-7}$



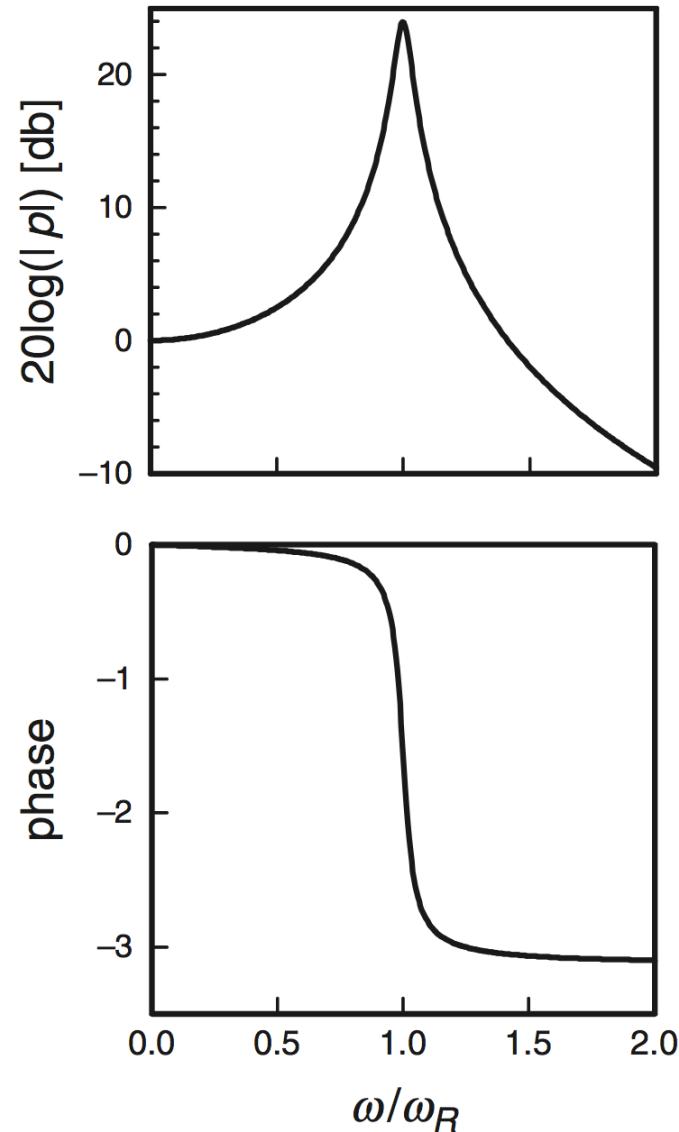
# Direct modulation



## Laser's modulation response

$$H(j\omega) = \frac{\delta S}{\delta I} = \frac{1}{1 - \omega^2/\omega_r^2 + 2j\omega\Gamma_d/\omega_r^2}$$

$$\phi(j\omega) = \frac{\delta\phi}{\delta I} = \arctan\left(-\frac{2\omega\Gamma_d}{\omega_r^2 - \omega^2}\right)$$



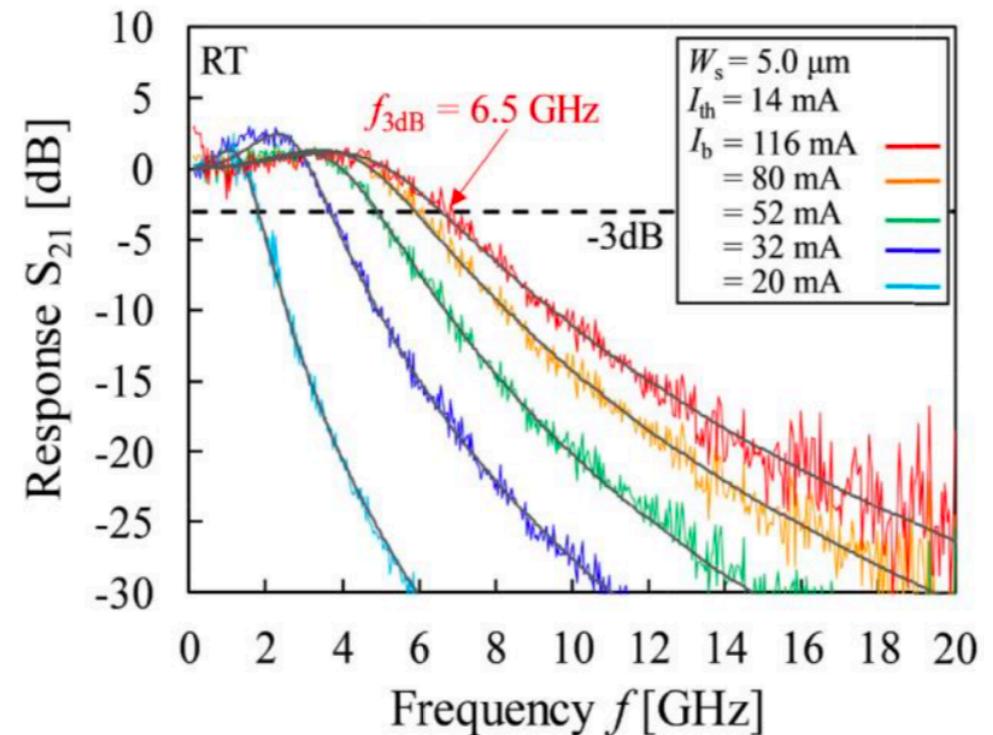
# Direct modulation

The modulation response peaks at the relaxation oscillation frequency

$$f_r^2 = \frac{1}{4\pi^2} \frac{G_N S_0}{\tau_p}$$

The 3dB modulation bandwidth scales with the oscillation frequency

$$f_{3dB} = f_r \sqrt{1 + \sqrt{2}}$$



At high bias & high modulation frequencies, the modulation response falls down (damping effect, carrier transport across the junction)



# ***Modulation dynamics***

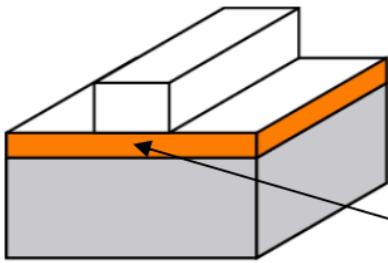
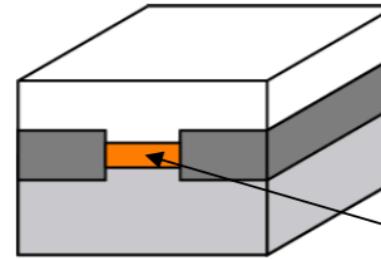
**How to increase the modulation speed ? Need to enhance the relaxation oscillation frequency & the 3dB modulation bandwidth**

- Increasing the photon density via a better confinement of the optical field in the active layer
- Biasing the laser at a higher pump current
- Increasing the differential gain  $G_N$  coefficient by cooling the device, doping active areas or by using quantum confined semiconductors (wells, dots)
- Reducing the photon lifetime by decreasing the laser cavity length



# *Modulation dynamics*

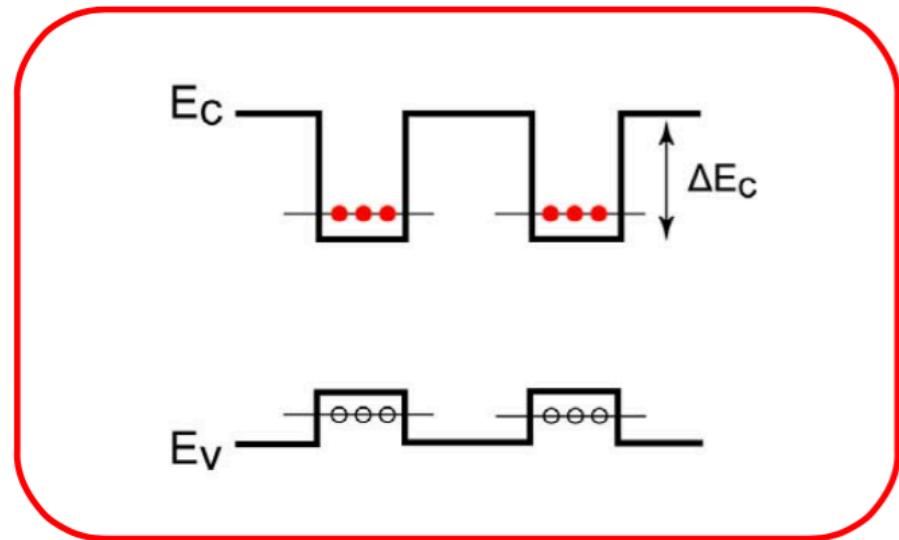
Decreasing active-region volume e.g. depends on waveguide structure

	Ridge waveguide structure	Buried heterostructure (BH)
	 Active layer	 Active layer
Active region	Defined by ridge width and current spreading	Defined by mesa width
Width	Relatively wide (Usually $> 2 \mu\text{m}$ )	Narrow (Usually $< 1.5 \mu\text{m}$ )
Fabrication	Etching of ridge	Etching of mesa and regrowth
Point	Control of guided optical mode and current spreading	Suppression of leakage current at regrowth interface and current blocking structure

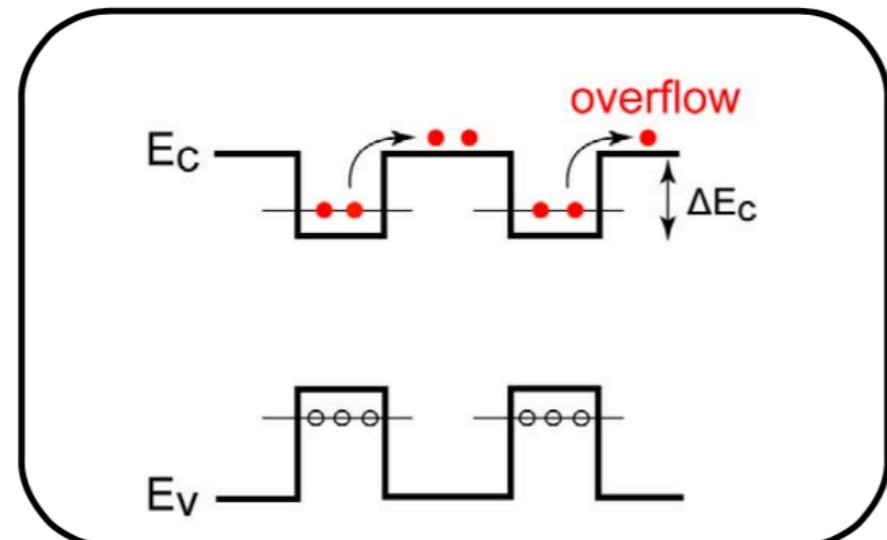
# Modulation dynamics

Increasing differential gain  $G_N \rightarrow$  quantum well semiconductors

AlGaInAs quantum well (QW)

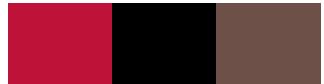


InGaAsP quantum well (QW)



Superior band diagram of AlGaInAs QW  
→ Large conduction band offset  $\Delta E_c$   
→ Small valence band offset  $\Delta E_v$

Better electron confinement → Increase modulation efficiency



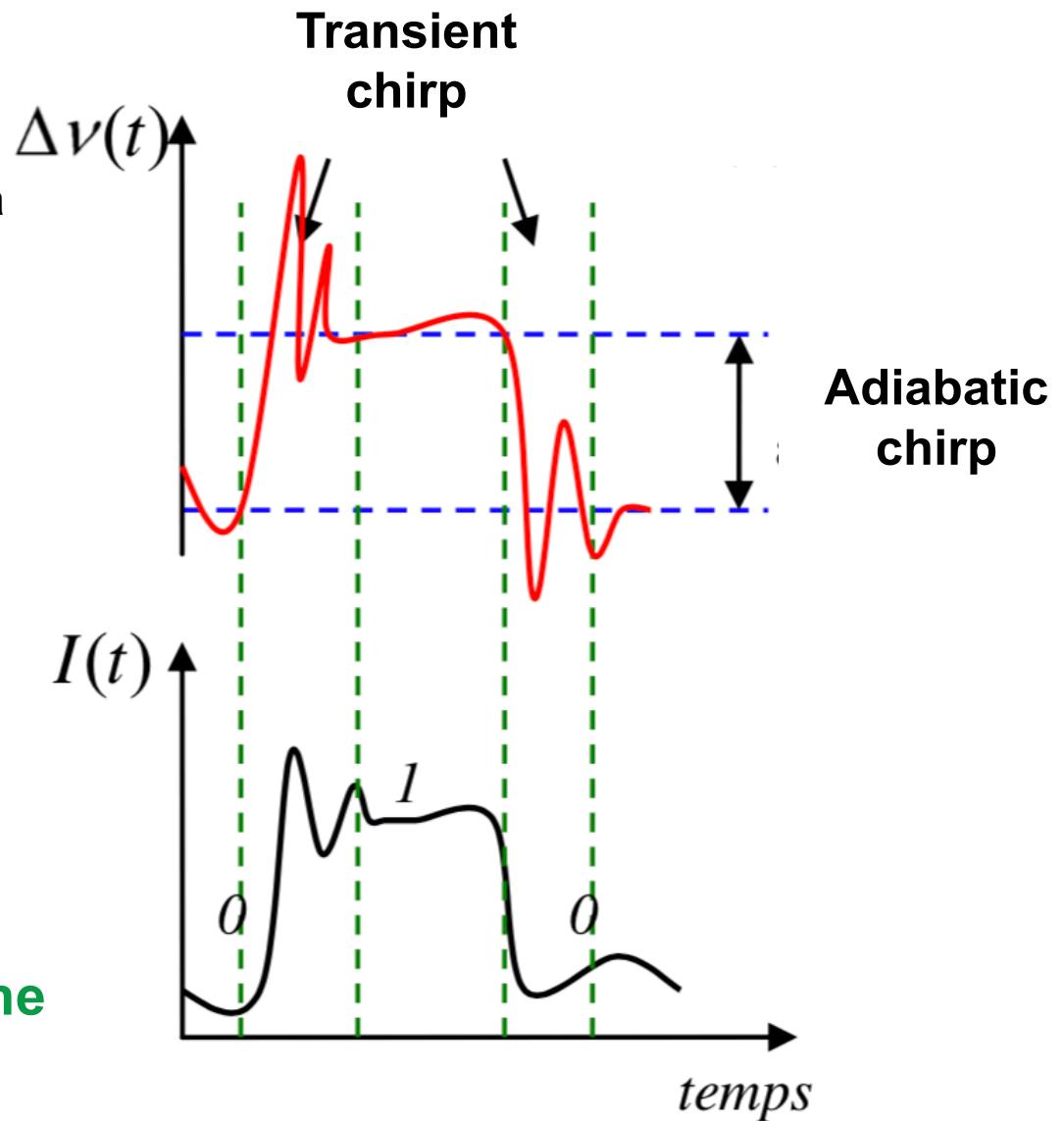
# Frequency chirping (dynamic)



Transient      Adiabatic

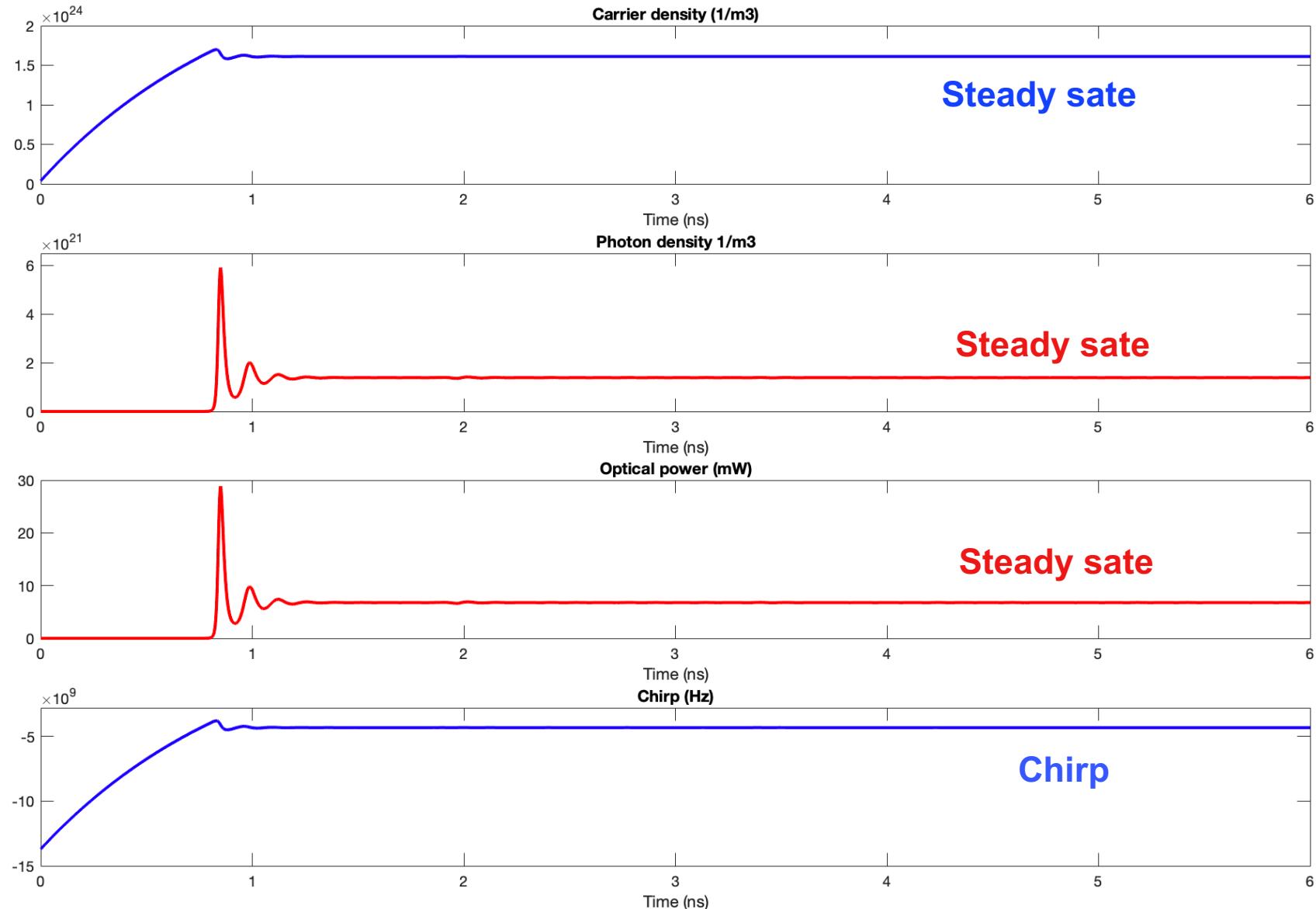
$$\Delta v = \frac{\alpha_H}{4\pi} \left( \frac{d}{dt} \ln S(t) + \kappa S(t) \right)$$

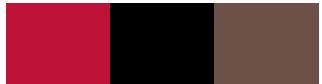
$\alpha_H = 0 \rightarrow$  chirpfree lasers  
No signal degradation during the transmission



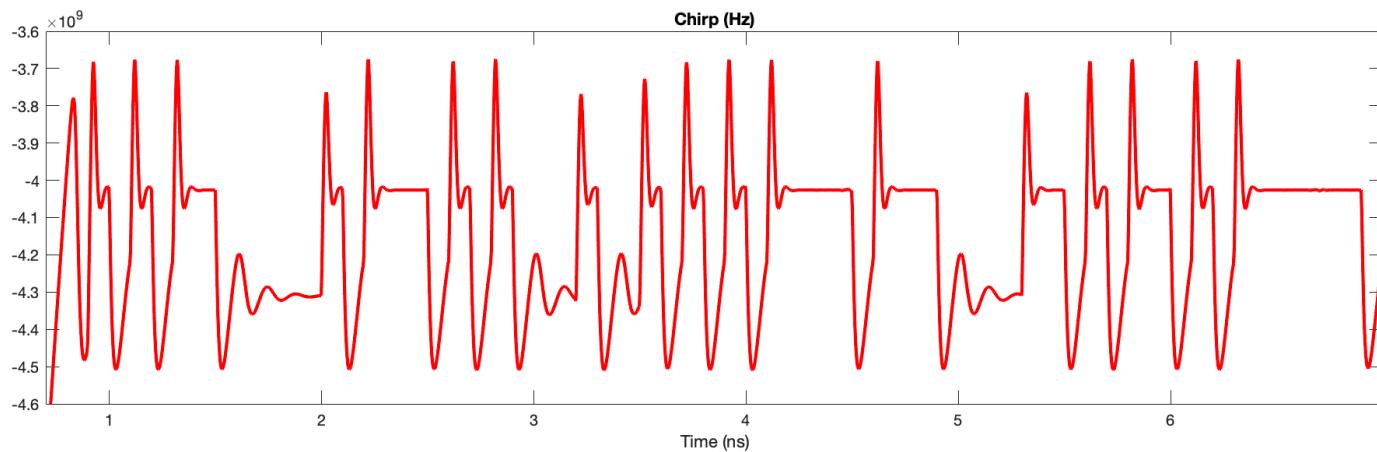
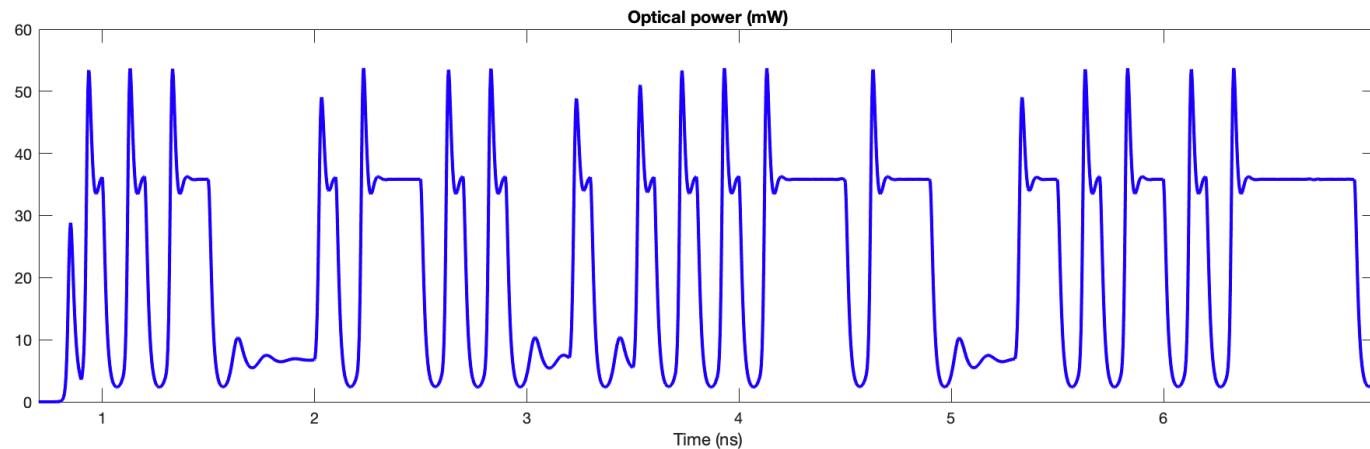
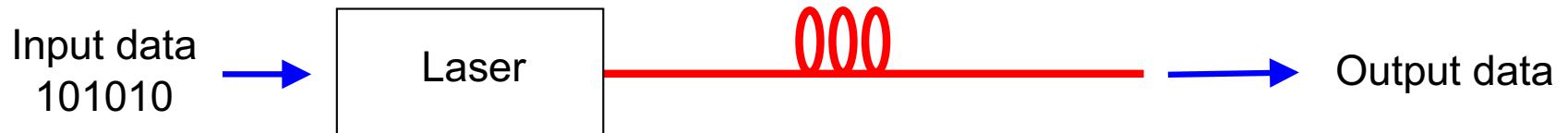


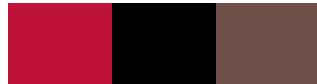
# Frequency chirping (static)



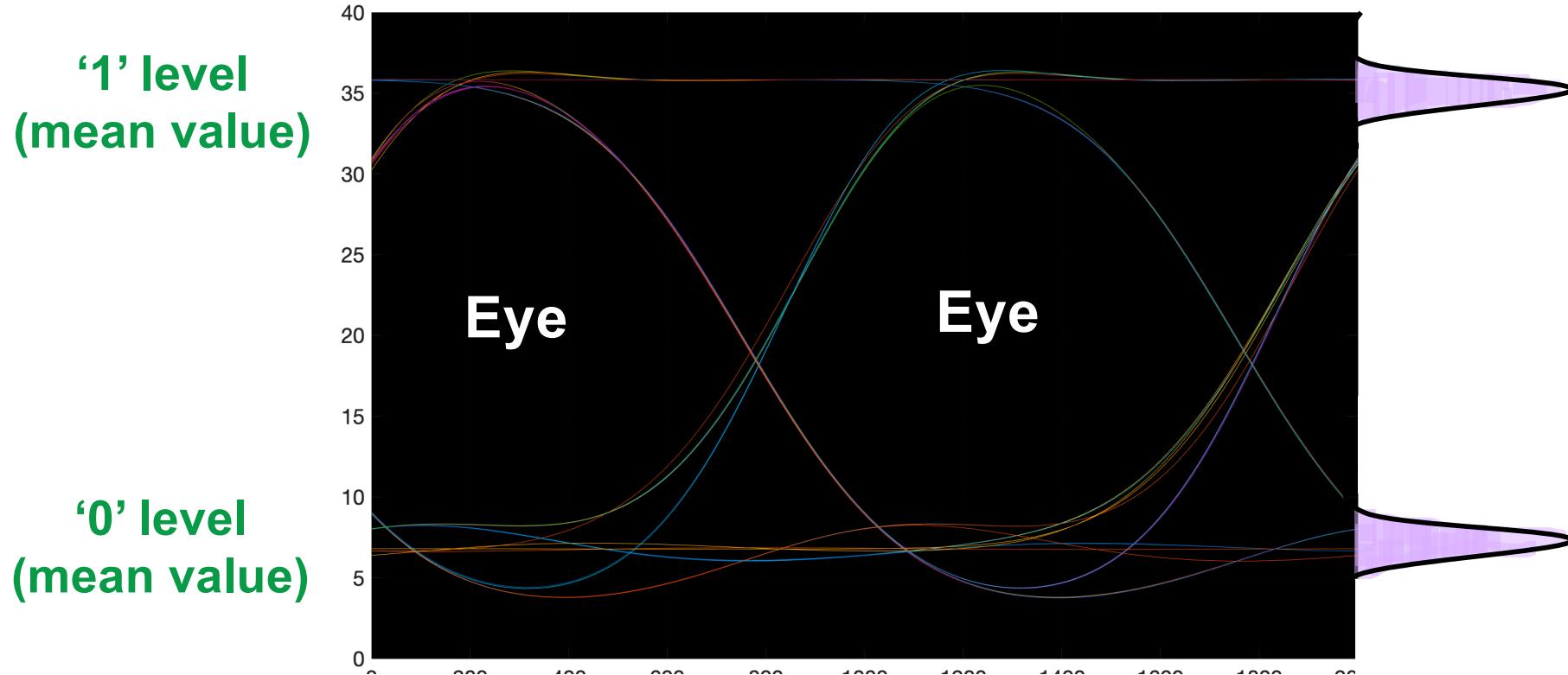
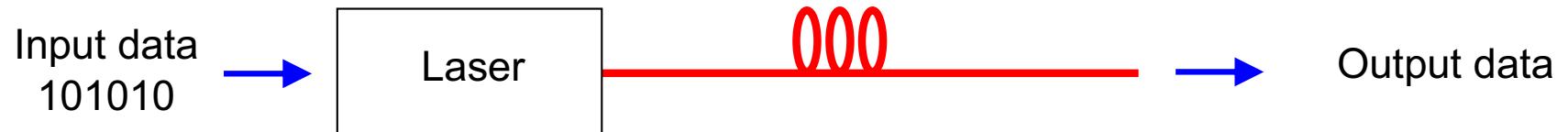


# Frequency chirping (dynamic)





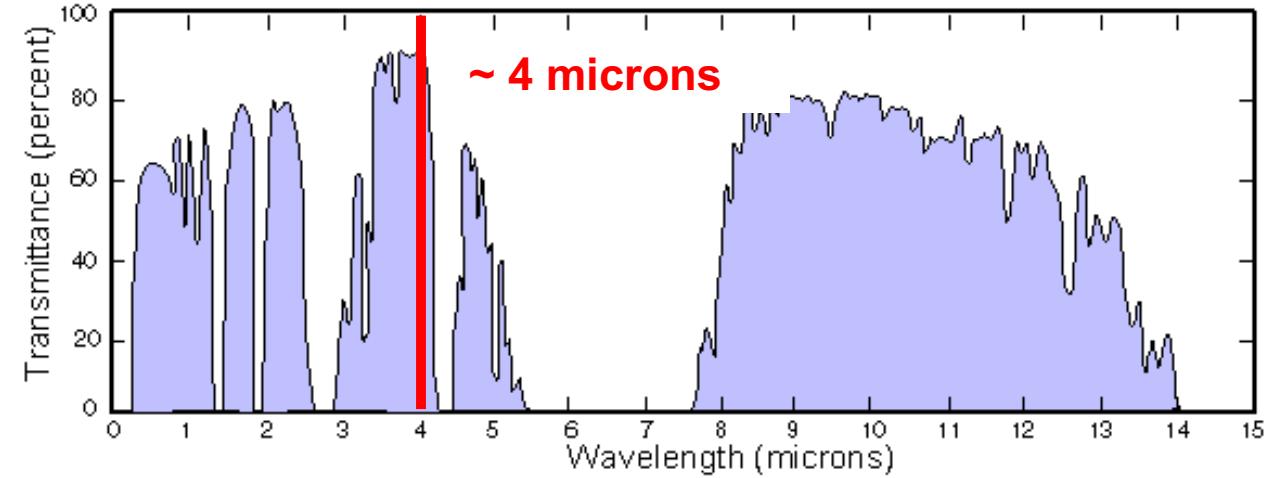
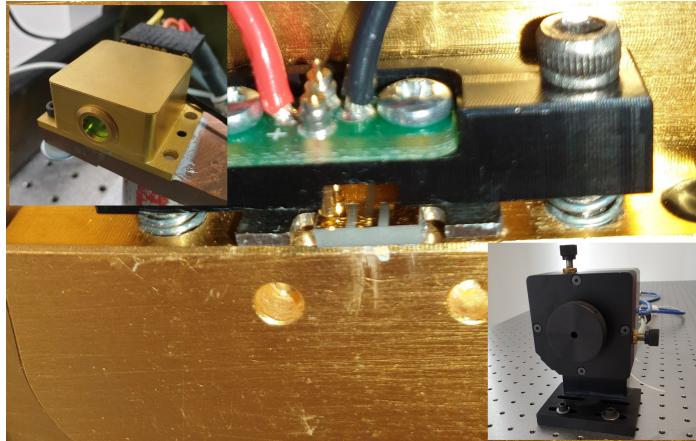
# Eye diagram



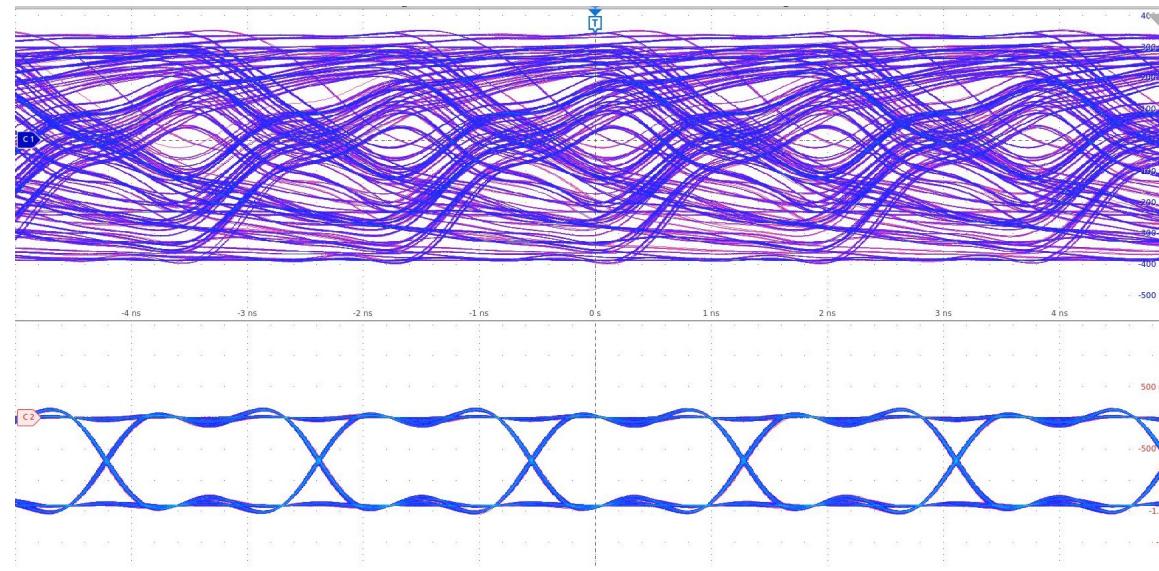
The eye diagram shows the effects of noise, jitter, distortion, inter-symbol interference, and crosstalk, all of which can close the eye and alter the data transmission



# Data transfer with quantum cascade lasers



*Detector signal*



**550 Mb/s**

*Seed signal*



# Nonlinear dynamics of semiconductor lasers



# *Outline*

- **Introduction to chaos theory**
- **Lorenz-Haken model**
- **Laser classifications**
- **Private communications with chaos**
- **Random bit generation**
- **Chaos for light detection & ranging**



# *The three revolutions in Physics*

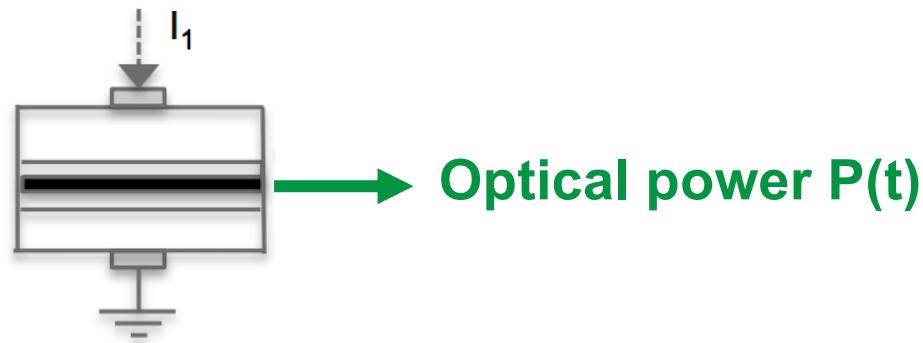
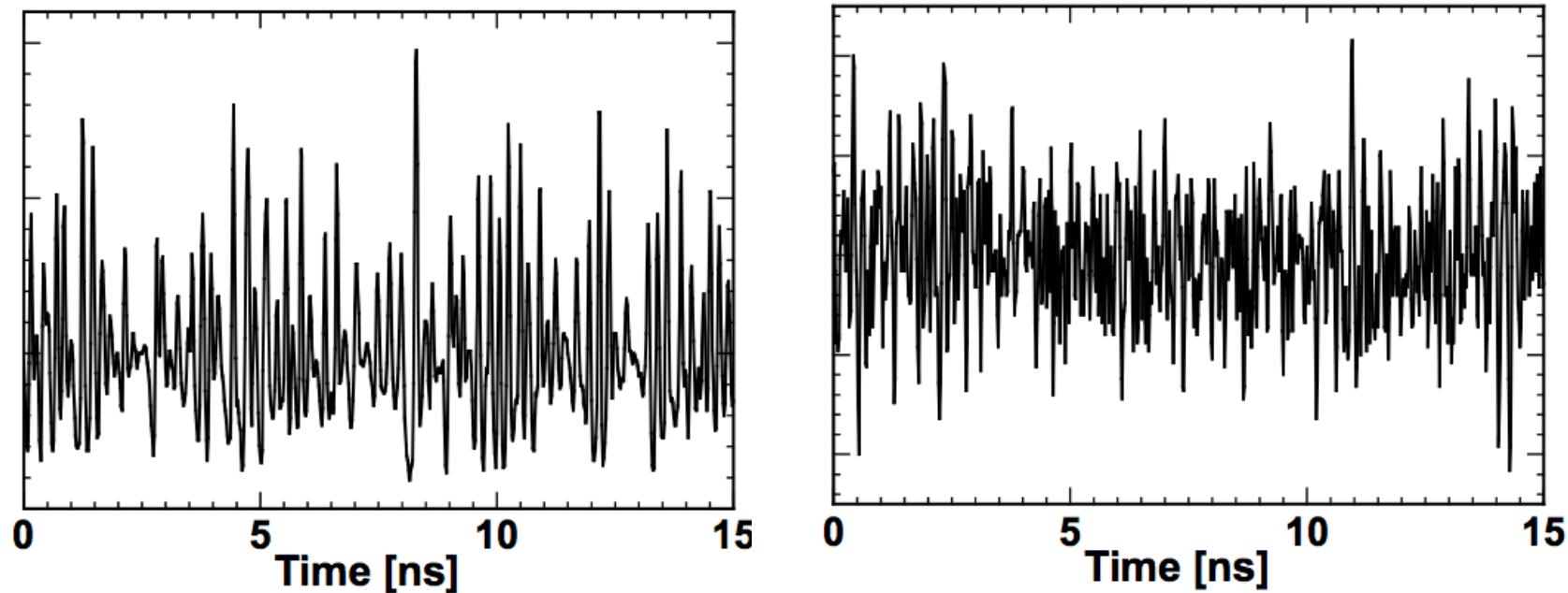
- Relativity theory
- Quantum mechanics
- Chaos theory

**Chaos is not an invention but a real discovery!**



# *Chaos versus noise?*

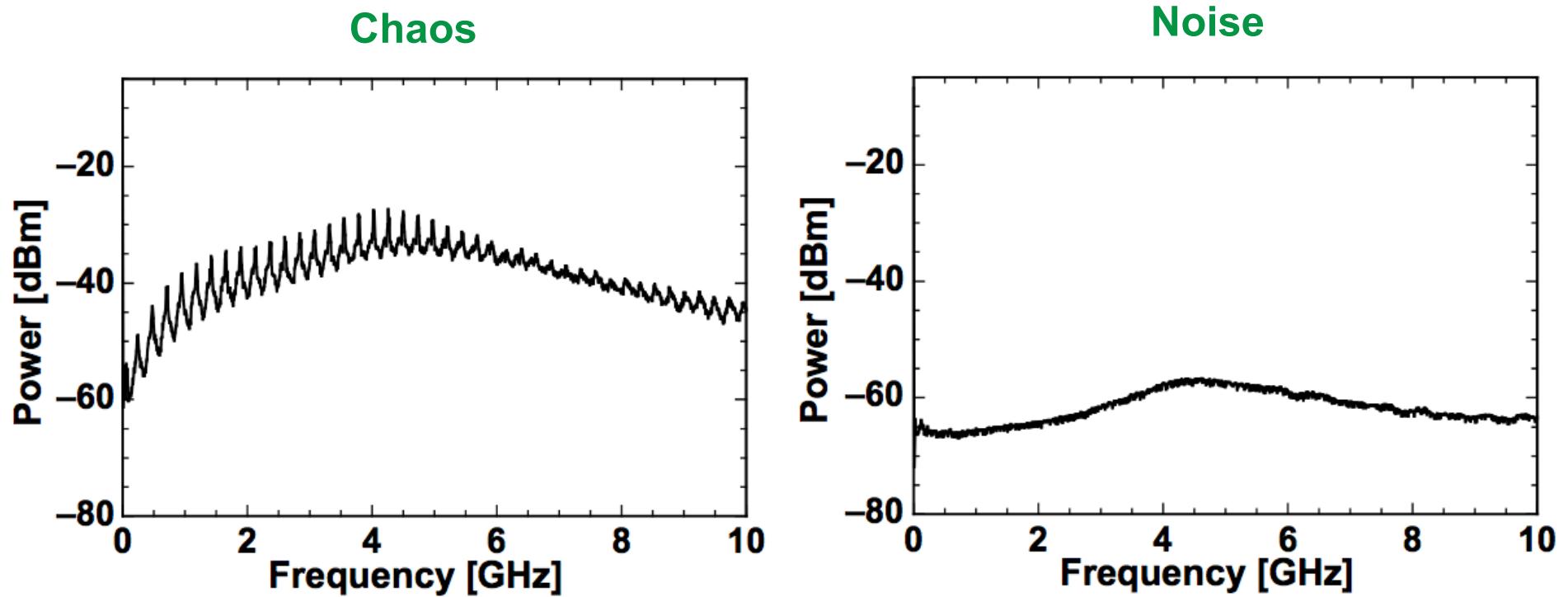
Temporal waveforms of laser intensity output in the diode laser



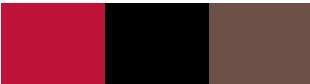


# *Chaos versus noise?*

Temporal waveforms of laser intensity output in the diode laser



Chaos is fundamentally driven by a characteristic frequency of the nonlinear system e.g. for a diode laser, the relaxation frequency (see later on)



# Navier-stokes equations



## ■ Weather prediction

$$\frac{\partial \rho}{\partial t} + \frac{\partial \rho u}{\partial x} + \frac{\partial \rho v}{\partial y} + \frac{\partial \rho w}{\partial z} = 0 \quad (1)$$

$$\frac{\partial \rho u}{\partial t} + \frac{\partial(\rho u^2)}{\partial x} + \frac{\partial(\rho uv)}{\partial y} + \frac{\partial(\rho uw)}{\partial z} = -\frac{\partial p}{\partial x} + \nu \left( \frac{\partial^2 u}{\partial x^2} + \frac{\partial^2 u}{\partial y^2} + \frac{\partial^2 u}{\partial z^2} \right) \quad (2)$$

$$\frac{\partial \rho v}{\partial t} + \frac{\partial(\rho uv)}{\partial x} + \frac{\partial(\rho v^2)}{\partial y} + \frac{\partial(\rho vw)}{\partial z} = -\frac{\partial p}{\partial y} + \nu \left( \frac{\partial^2 v}{\partial x^2} + \frac{\partial^2 v}{\partial y^2} + \frac{\partial^2 v}{\partial z^2} \right) \quad (3)$$

$$\frac{\partial \rho w}{\partial t} + \frac{\partial(\rho uw)}{\partial x} + \frac{\partial(\rho vw)}{\partial y} + \frac{\partial(\rho w^2)}{\partial z} = -\frac{\partial p}{\partial z} + \nu \left( \frac{\partial^2 w}{\partial x^2} + \frac{\partial^2 w}{\partial y^2} + \frac{\partial^2 w}{\partial z^2} \right) \quad (4)$$

$$\frac{\partial \rho E}{\partial t} + \frac{\partial(\rho u E)}{\partial x} + \frac{\partial(\rho v E)}{\partial y} + \frac{\partial(\rho w E)}{\partial z} = -\frac{\partial p u}{\partial x} - \frac{\partial p v}{\partial y} - \frac{\partial p w}{\partial z} + S \quad (5)$$

where  $\rho$  is the air density,  $u, v, w$  are the components of the air's velocity,  $E$  is measure of the air's internal energy (which allows us to compute its temperature) and  $p$  is the air pressure.

**These equations can not be solved analytically and even numerically it requires the use of a super computer!**

Brian J. Cantwell, Fundamentals of Compressible Flows, Course from Stanford University



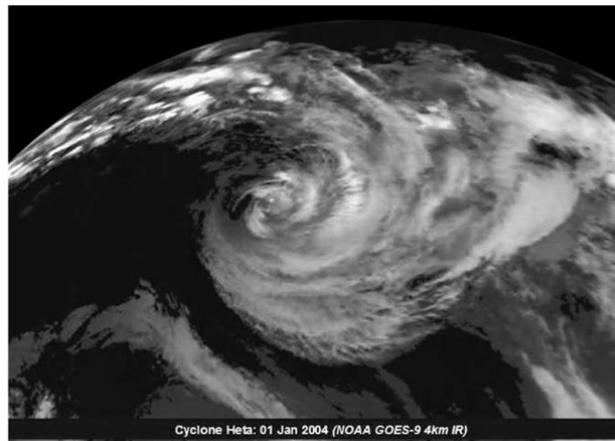
# The Lorenz model

- Edward Lorenz gave rise to the modern field of chaos theory. His model consists on a very simplified approach made with three coupled ordinary differential equations, describing the fluid convection and temperature

$$\frac{dx(t)}{dt} = \sigma(y(t) - x(t))$$

$$\frac{dy(t)}{dt} = -x(t)z(t) + rx(t) - y(t)$$

$$\frac{dz(t)}{dt} = x(t)y(t) - bz(t)$$

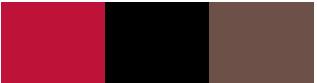


Edward Lorenz  
(1917-2008)

(x,y,z) symbolizes a state of the atmosphere

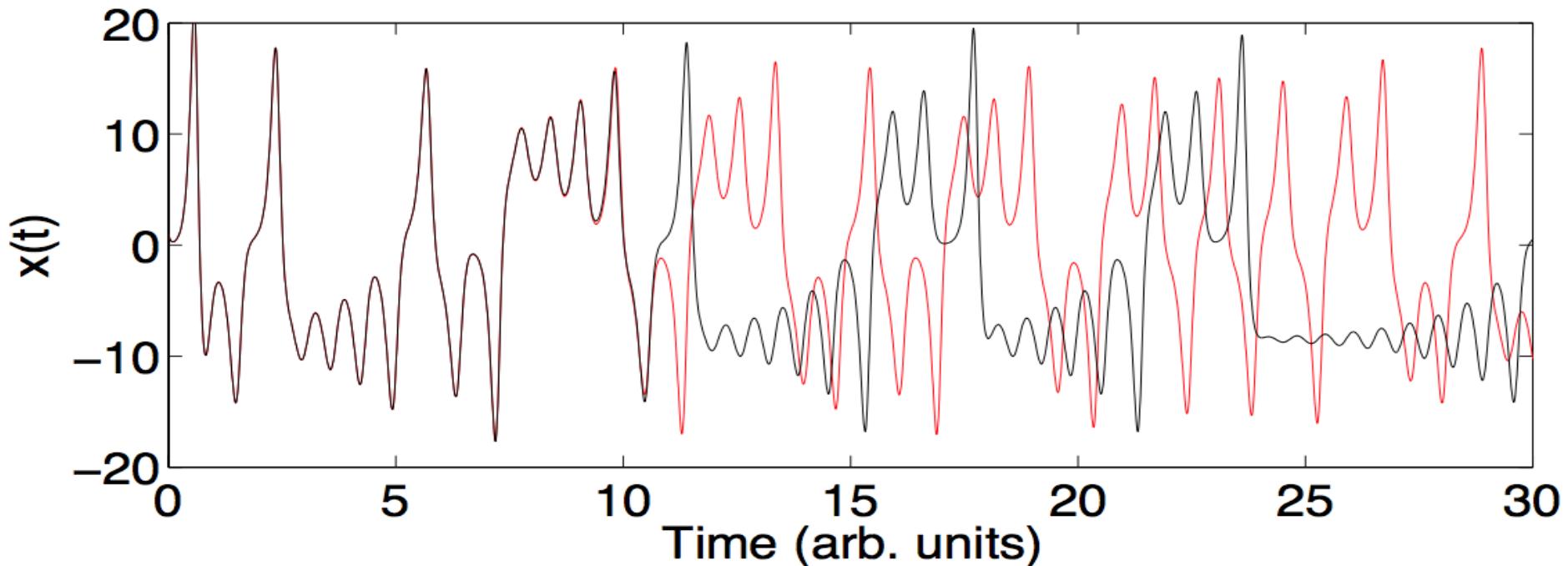
The Lorenz's model has three degrees of freedom and enough nonlinearity to generate chaotic dynamical behavior

E. Lorenz, Deterministic nonperiodic flow, J of the Atmospheric Science, vol. 20, p. 130 (1963)



## The Lorenz model

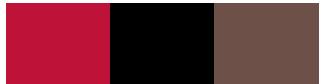
- The Lorenz's model shows a remarkable feature, **the sensitive dependence on initial conditions** that result in the trajectories in phase space diverging exponentially fast away from each other



$$[X_0, Y_0, Z_0] = [0, 1, 1.05]$$

$$[X_0, Y_0, Z_0] = [0.000001, 1.000001, 1.05000001]$$

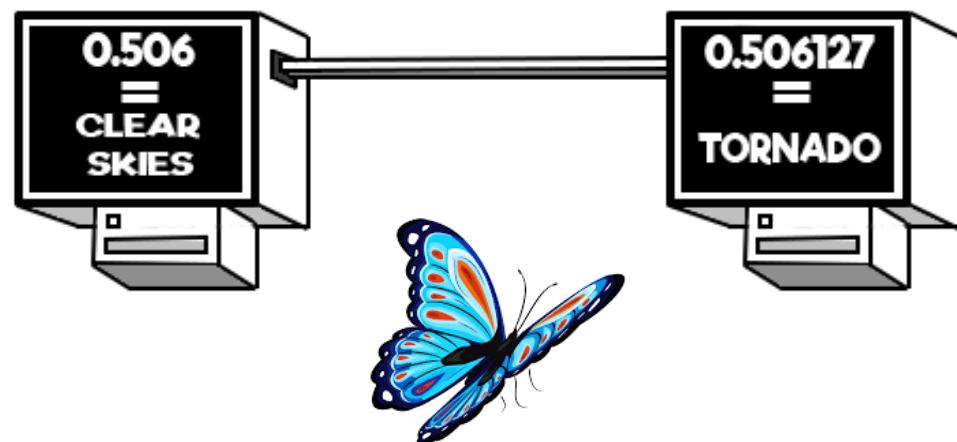
E. Lorenz, Deterministic nonperiodic flow, J of the Atmospheric Science, vol. 20, p. 130 (1963)



## *The Lorenz model*

- A sad ending? In view of the inevitable inaccuracy and incompleteness of weather observations, precise very long-range forecasting would seem to be non-existent

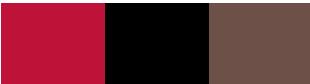
**Does the flap of a butterfly's wings in Brazil  
set off a tornado in Texas?**



Edward Lorentz

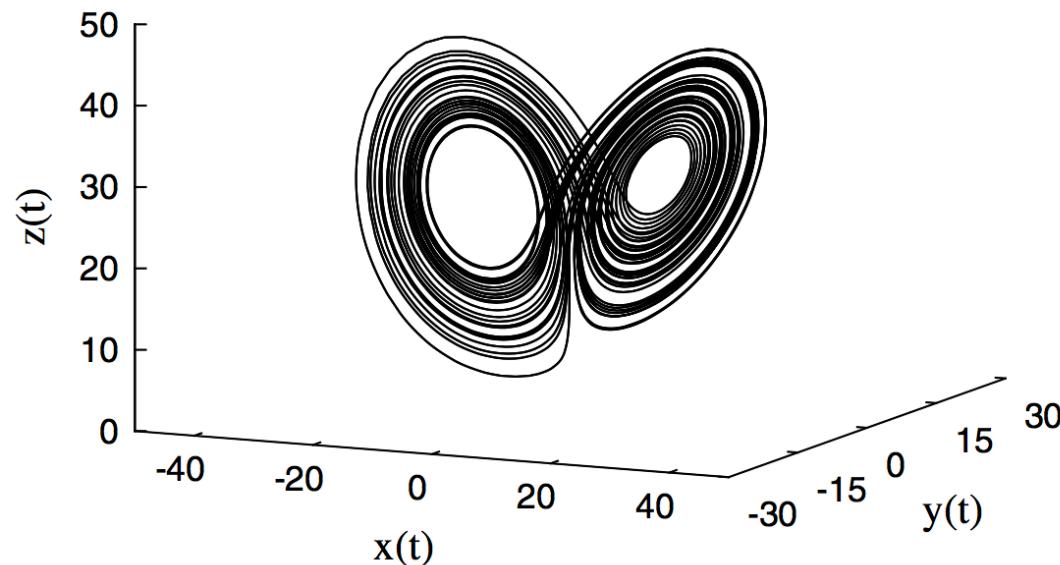
Paper presented at a conference

Washington D.C. 1972



## The Lorenz model

- A strange (chaotic) attractor consists on fractal structure, where multiscale similarity of the density of trajectories exists. Here the chaotic attractor looks like a butterfly, and it is called the butterfly attractor



**Two points on the attractor that are near each other at one time will be arbitrarily far apart at later times. Strange attractors are unique in that the motion of the system never repeats (non-periodic)**

E. Lorenz, Deterministic nonperiodic flow, J of the Atmospheric Science, vol. 20, p. 130 (1963)



# *Three fingerprints of chaos*

- Trajectory is never periodic, but coasts along an imaginary surface called a strange attractor
- Extreme sensitivity to initial conditions
- Sensitive dependence on initial conditions is equivalent to stating that nearby trajectories will diverge exponentially e.g. continuous systems in a 2-dimensional phase space cannot experience such a divergence

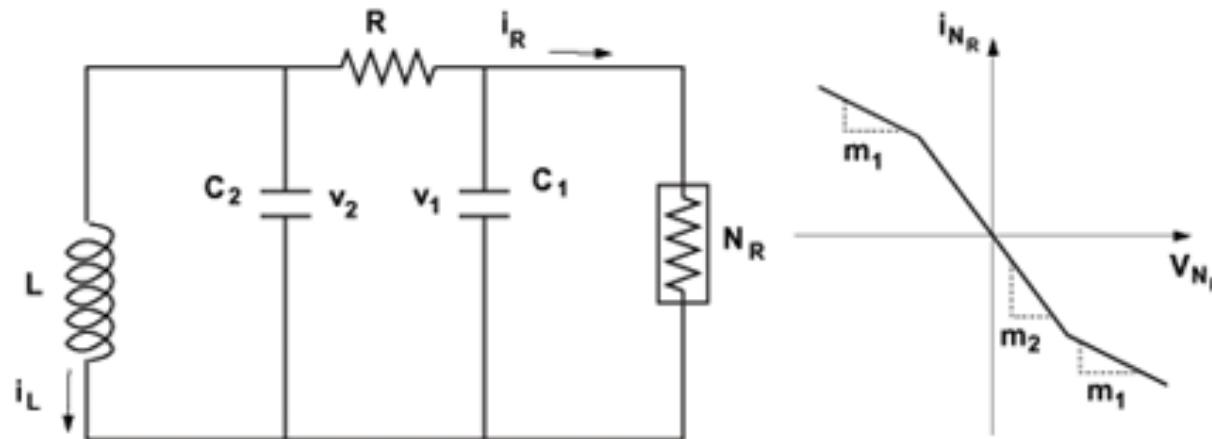
Poincaré-Bendixon theorem (!)

Chaotic behaviors can only be observed in deterministic continuous systems with a phase space of dimension 3, at least

S. Strogatz, “Nonlinear Dynamics and Chaos with application to physics, biology, chemistry and engineering”, Perseus Book (1994)

# The Chua's circuit, the birth of chaos-based engineering applications

- In 1983, a Berkeley professor, Leon Chua, proposed an electronic circuit exhibiting rich complex nonlinear dynamics including chaos



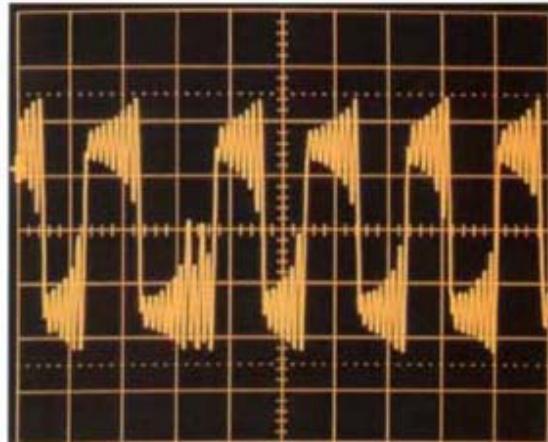
Leon Chua  
(1936-)

$$\begin{aligned} C_1 \frac{dv_1}{dt} &= \frac{(v_2 - v_1)}{R} - h(v_1), \\ C_2 \frac{dv_2}{dt} &= \frac{(v_1 - v_2)}{R} + i_L, \\ L \frac{di_L}{dt} &= -v_2, \end{aligned}$$

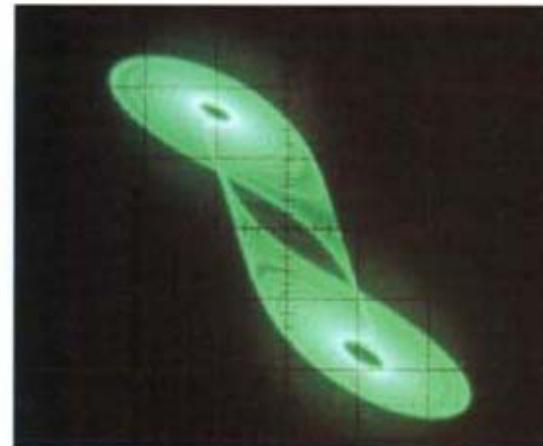
L. Chua et al., IEEE Transactions on Circuits and Systems vol. 33, p. 1072 (1986)



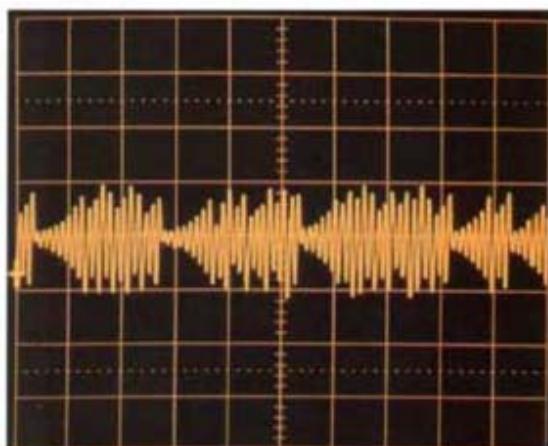
# *The Chua's circuit, the birth of chaos-based engineering applications*



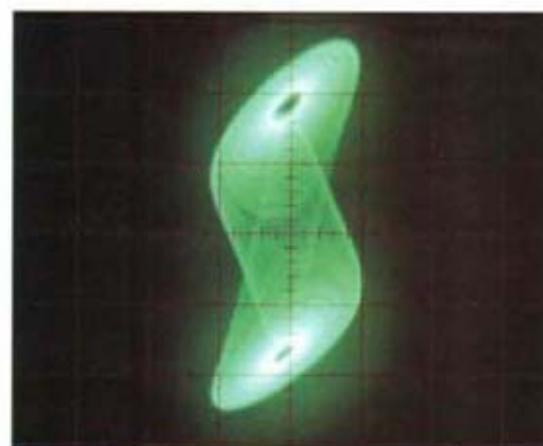
(a)



(d)



(b)



(e)

**The Chua's circuit exhibiting a double-scroll attractor named as the Chua's attractor is the first experimental proof of chaos (1986)**

# The first laser instabilities

PHYSICAL REVIEW

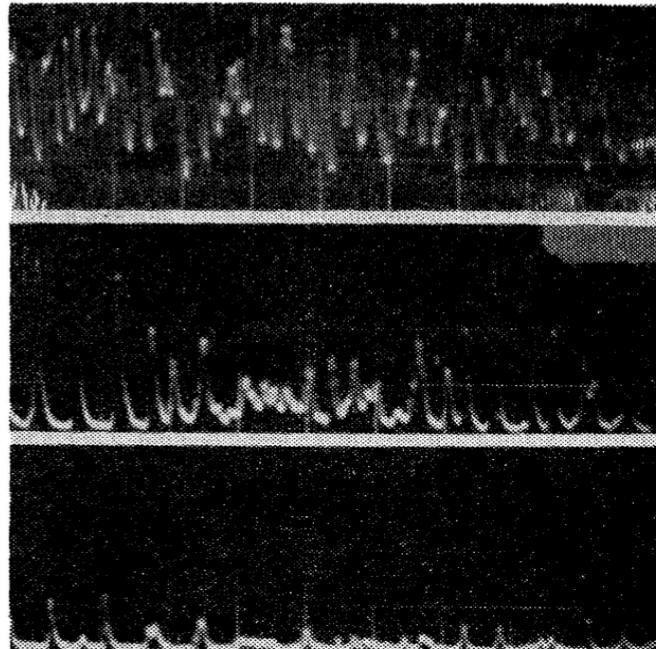
VOLUME 123, NUMBER 4

AUGUST 15, 1961

## Stimulated Optical Emission in Fluorescent Solids. II. Spectroscopy and Stimulated Emission in Ruby

T. H. MAIMAN,\* R. H. HOSKINS,\* I. J. D'HAENENS, C. K. ASAWA, AND V. EVTUHOV  
*Hughes Research Laboratories, A Division of Hughes Aircraft Company, Malibu, California*  
(Received January 27, 1961)

FIG. 13. Output pulse from ruby on an expanded time scale ( $10 \mu\text{sec}/\text{division}$ ). (a), (b), and (c) represent the output approximately 600, 1000, and 1200  $\mu\text{sec}$  after the onset of oscillation. The vertical sensitivity and the base line are the same in each case.



These initial observations were either left unexplained or wrongly attributed to noise!

T. H. Maiman et al., Phys. Rev., vol. 123, pp. 1151 (1961)

# Analogy between fluids and lasers

## Lorenz

$$\frac{dx(t)}{dt} = \sigma(y(t) - x(t))$$

$$\frac{dy(t)}{dt} = -x(t)z(t) + rx(t) - y(t)$$

$$\frac{dz(t)}{dt} = x(t)y(t) - bz(t)$$



## Lorenz-Haken

$$\frac{dx(t)}{dt} = \sigma(y(t) - x(t))$$

$$\frac{dy(t)}{dt} = -x(t)z(t) + rx(t) - (1 - i\delta)y(t)$$

$$\frac{dz(t)}{dt} = \text{Re}(x^*(t)y(t)) - bz(t)$$

- Lorenz:  $x(t)$ ,  $y(t)$ , and  $z(t)$  represent properties of the convecting fluid flow, and temperature differences between the left- and right-hand sides of the cell of fluid and between its top and bottom, respectively
- Lorenz-Haken:  $x(t)$ ,  $y(t)$ , and  $z(t)$  represent the time evolution of the scaled electric field, the atomic polarization, and the population inversion

H. Haken, Physics Letters A vol. 53, p. 77 (1975)



# Laser classification

- Number of variables can be reduced by adiabatic elimination
- Need to know the timescale of each variable with respect to each other

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	<b>Variables to describe dynamics</b>	<b>Examples of lasers</b>
Class A	Electric field (photons)	He-Ne lasers (632.8 nm) Dye lasers
Class B	Electric field (photons) Population inversion (atoms)	Semiconductor lasers Solid-state lasers CO <sub>2</sub> lasers
Class C	Electric field (photons) Population inversion (atoms) Polarization (matter)	He-Ne lasers (3.39 μm) He-Xe lasers (3.51 μm) NH <sub>3</sub> lasers

---



**Fortunato Tito Arecchi**  
**(1933-)**

F. T. Arecchi et al., Opt. Comm., vol. 51, pp. 308 (1984)



# Laser classification

- 3 dynamical variables with same timescales hence 3 equations are required to describe the laser's dynamic

$$\kappa_c \approx \gamma_{\perp} \approx \gamma_{\parallel}$$

$$\frac{dE(t)}{dt} = -\kappa(E(t) + AP(t))$$

$\kappa_c$       Electric field decay rate  
 $\gamma_{\parallel}$       Population inversion decay rate  
 $\gamma_{\perp}$       Atomic polarization decay rate

$$\frac{dP(t)}{dt} = -P(t) - E(t)D(t)$$

$$\frac{dD(t)}{dt} = \gamma(1 - D(t) + E(t)P(t))$$

$$\kappa = \kappa_c / \gamma_{\perp} \quad \gamma = \gamma_{\parallel} / \gamma_{\perp}$$

**Class C lasers satisfy the necessary condition for generating chaos  
i.e., at least three independent variables are necessary for chaos,  
and chaotic behaviors are easily observed**

F. T. Arecchi et al., Opt. Comm., vol. 51, pp. 308 (1984)



# Laser classification

- Atomic polarization much faster e.g. 2 dynamical variables required

$$\gamma_{\perp} \gg \kappa_c > \gamma_{\parallel}$$

- Laser's dynamic is described with two equations (field and population)

$$\frac{dE(t)}{dt} = \kappa(-1 + AD(t))E(t)$$

$\kappa_c$       Electric field decay rate  
 $\gamma_{\parallel}$       Population inversion decay rate  
 $\gamma_{\perp}$       Atomic polarization decay rate

$$\frac{dD(t)}{dt} = \gamma(1 - D(t) - E^2(t)D(t))$$

Class B lasers do not satisfy the condition for generation of chaos.  
They are stable in nature. The phase space is 2-dimensional and  
allows fixed points and periodic trajectories term limit cycles

F. T. Arecchi et al., Opt. Comm., vol. 51, pp. 308 (1984)



# Laser classification

- Both atomic polarization and population inversion relax very fast e.g. 1 dynamical variable is required

$$\gamma_{\perp} \approx \gamma_{||} \gg \kappa_c$$

- Laser's dynamic can be described with only one equation (electric field)

$$\frac{dE(t)}{dt} = \kappa \left( -1 + \frac{A}{1 + E^2(t)} \right) E(t)$$

$\kappa_c$   
 $\gamma_{||}$   
 $\gamma_{\perp}$

Electric field decay rate  
Population inversion decay rate  
Atomic polarization decay rate

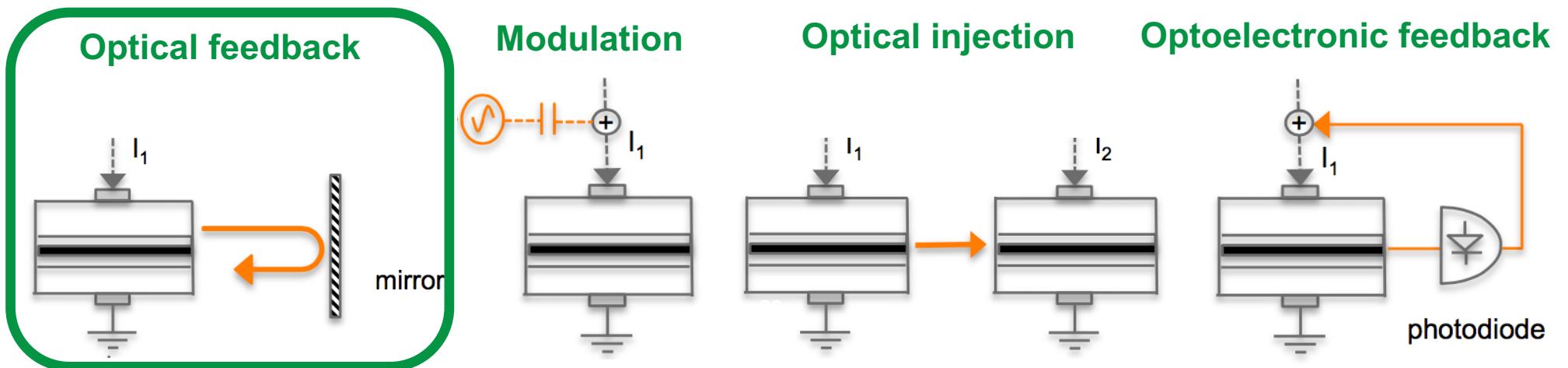
$$\approx \kappa (-1 + A - AE^2(t)) E(t)$$

Class A lasers are the most stable lasers, however, they may show chaotic behaviors by external perturbations with two or more extra degrees of freedom, as in the case of class B lasers

F. T. Arecchi et al., Opt. Comm., vol. 51, pp. 308 (1984)

# Chaos generation in diode lasers

- Adding external perturbations allow to fulfill the Poincaré-Bendixon and a minimum of 3 degrees of freedom is at least obtained

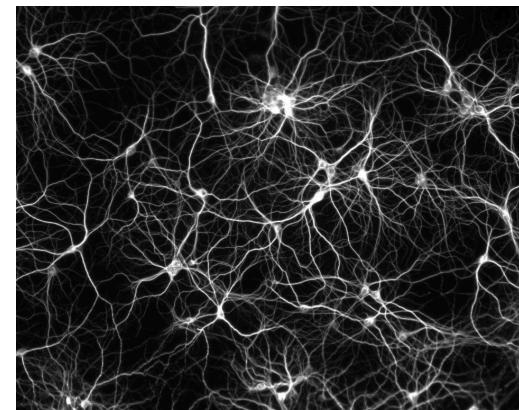


- Some other optical feedback systems

Traffic



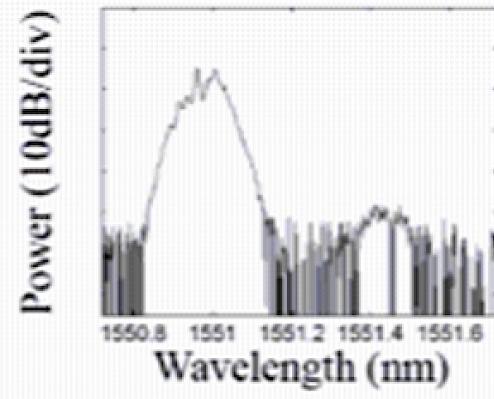
Neurons



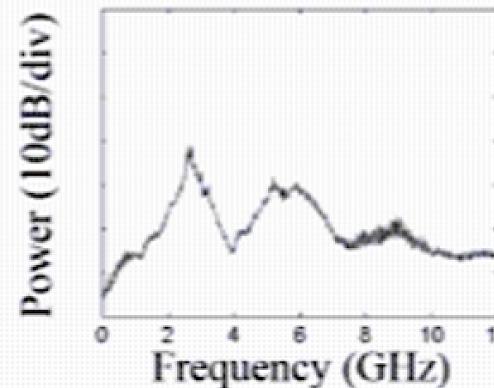
# Chaos-based applications

- Private communications, light detection and ranging, random bit generation
- Manifestation of chaos : complex dynamics in the optical & electrical domains; chaos attractor in the phase-space ( $I$ ,  $dI/dt$ ) with  $I$ : photon density

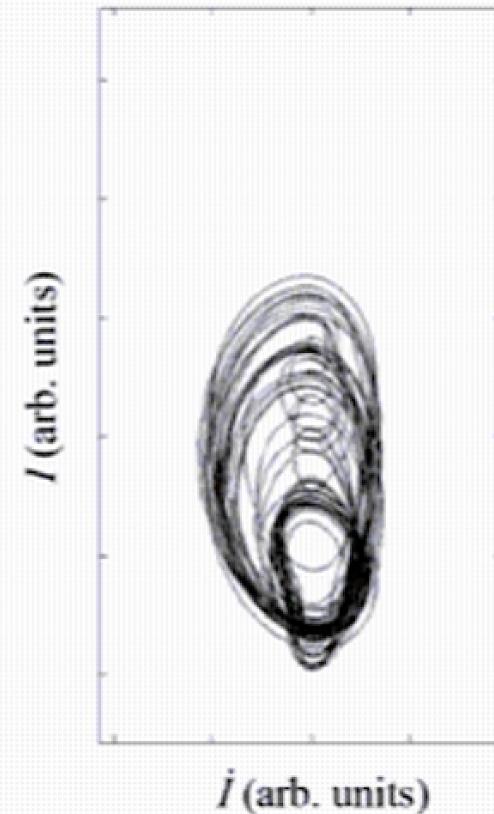
Large optical spectrum

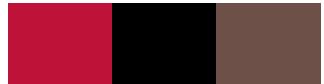


Large electrical spectrum



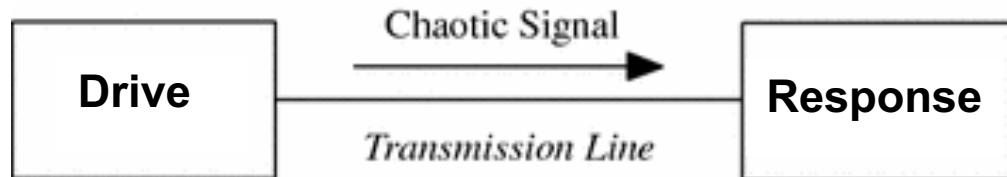
Complex phase space





# Chaos synchronization

- Drive & response lasers synchronize themselves



VOLUME 64, NUMBER 8

PHYSICAL REVIEW LETTERS

19 FEBRUARY 1990

## Synchronization in Chaotic Systems

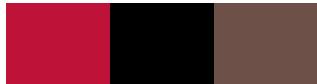
Louis M. Pecora and Thomas L. Carroll

*Code 6341, Naval Research Laboratory, Washington, D.C. 20375*

(Received 20 December 1989)

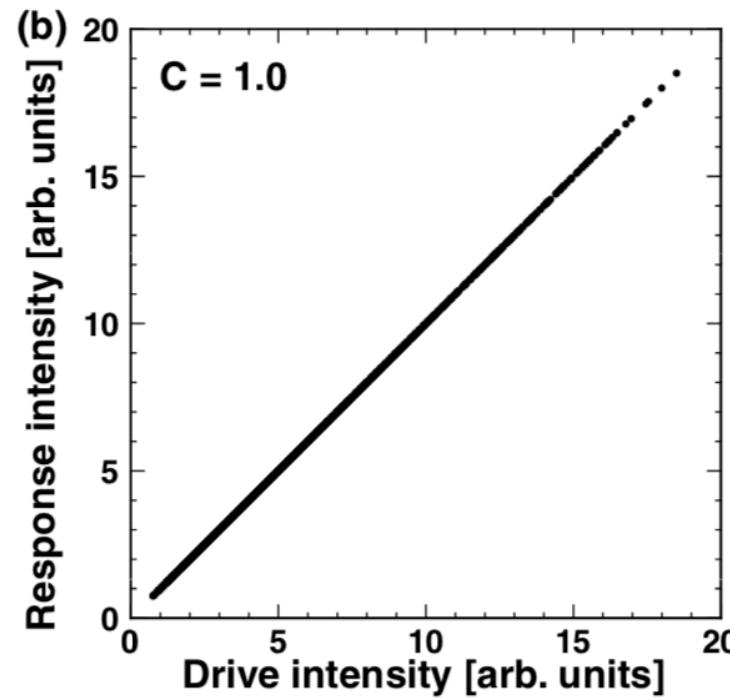
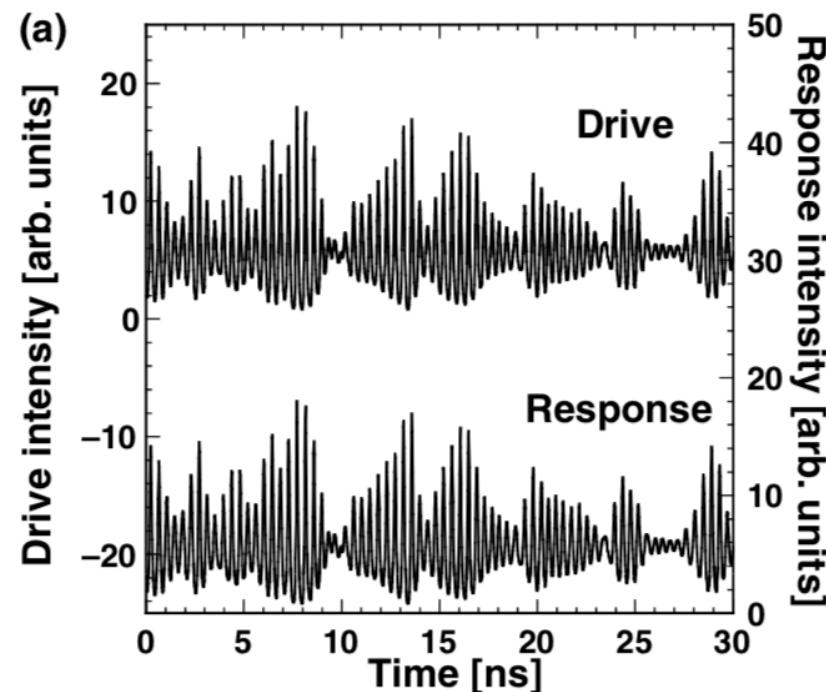
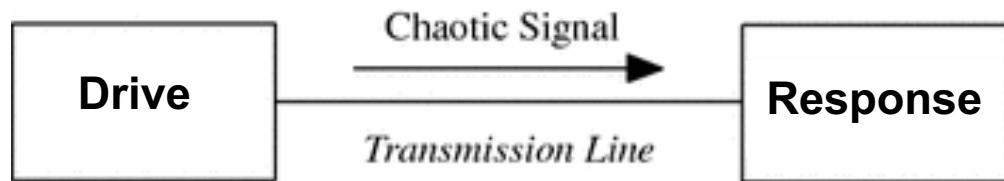
- A very elegant mathematical proof of the synchronization can be conducted by extracting the Lyapunov function associated to the error function

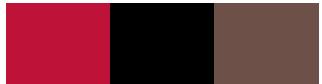
R. He and P. G. Vaidya, Phys. Rev. E. vol. 57, p. 1532 (1998)



# Chaos synchronization

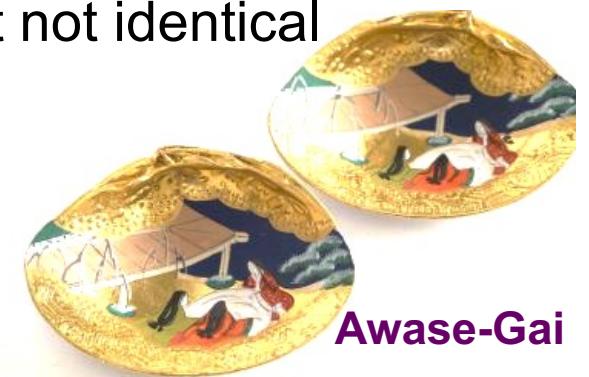
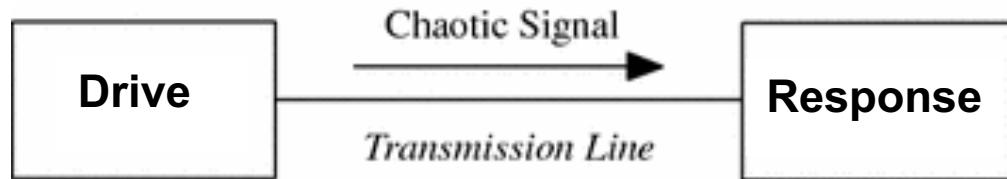
- Identical lasers leads to identical synchronization



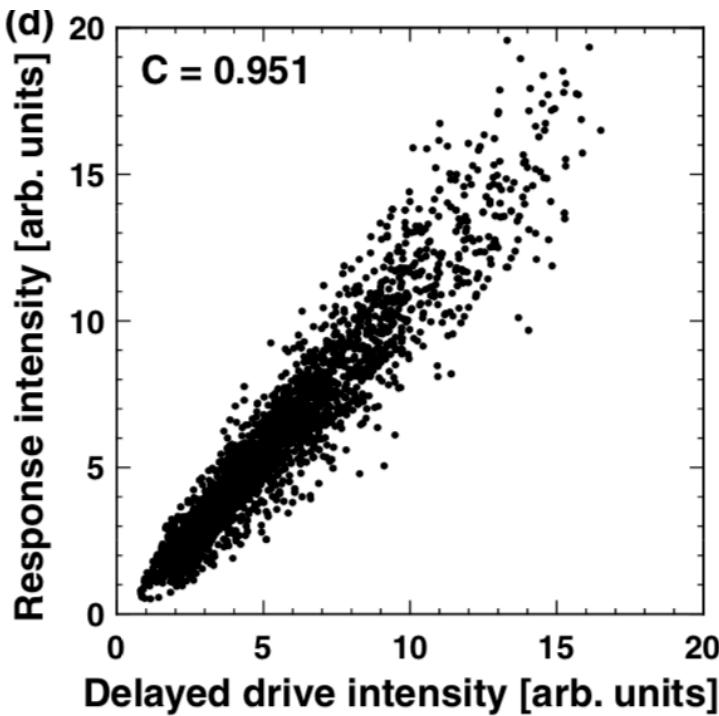
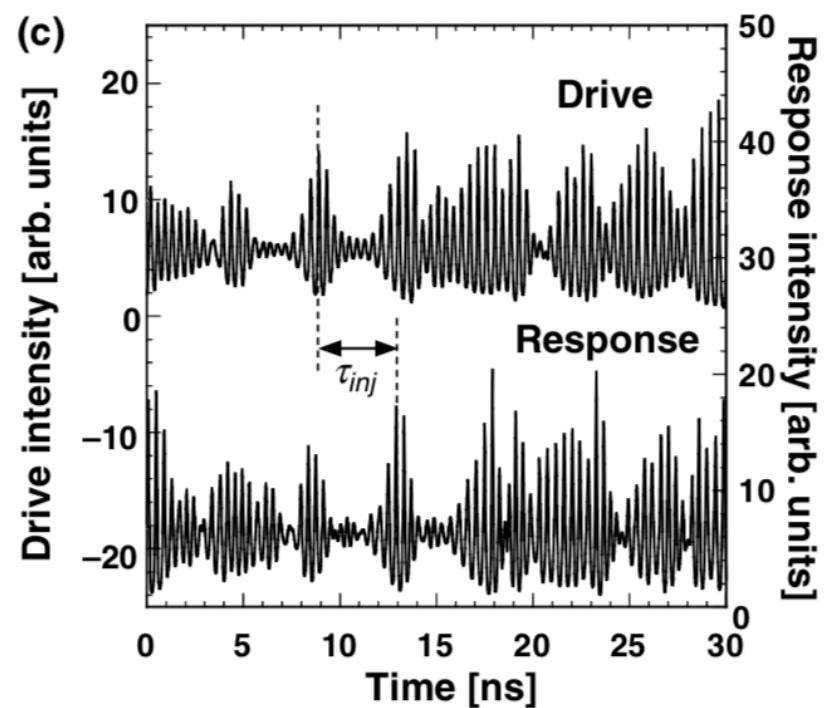


# Chaos synchronization

- Non-identical lasers: the synchronization is good but not identical



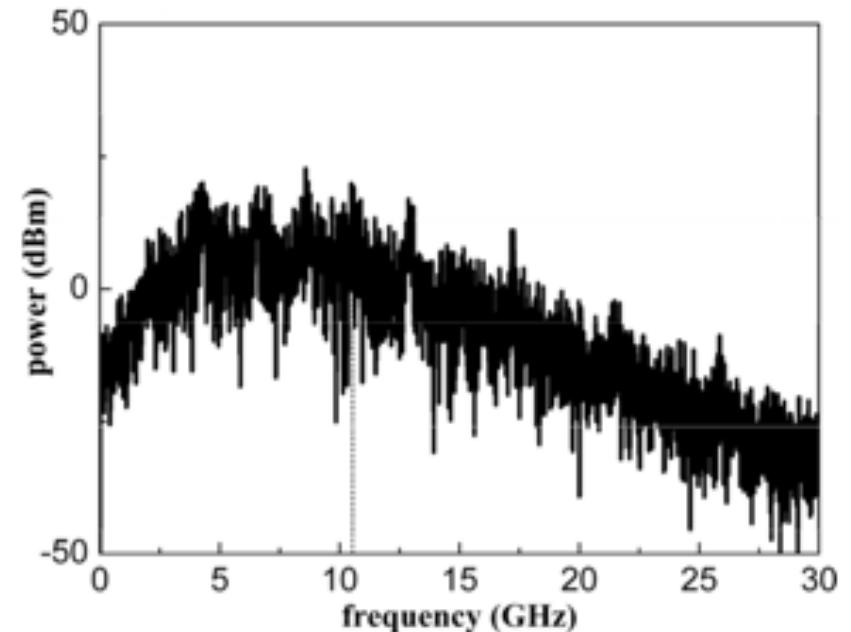
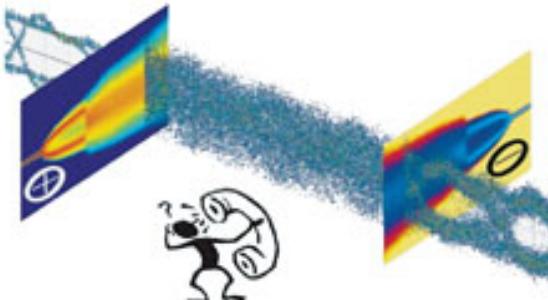
Awase-Gai





# Private communications

- The broadband chaotic signal can be used for increasing privacy



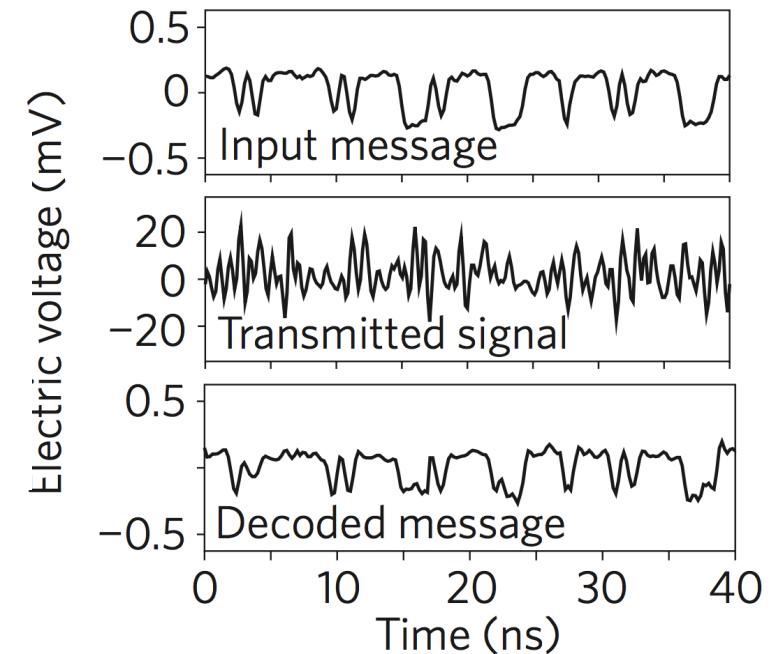
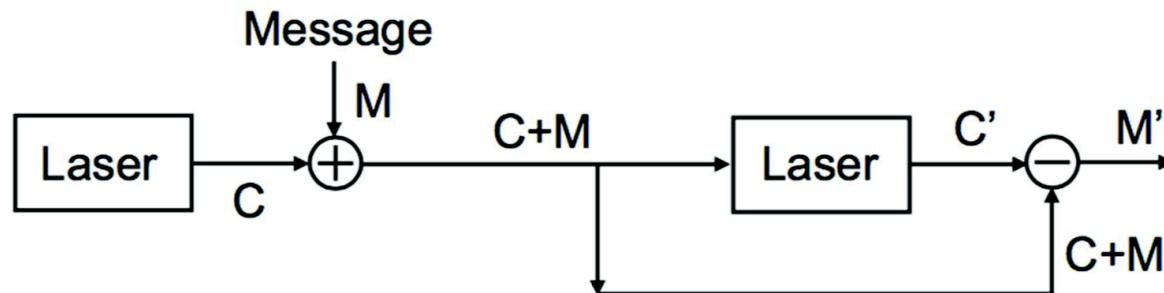
The generation of the chaos is based on the input signal, so only the receiver that has knowledge on how the chaos is generated can reproduce the chaos and cancel it to recover the signal

A. Uchida, Optical Communication with Chaotic Lasers, Wiley, (2012)



# Private communications

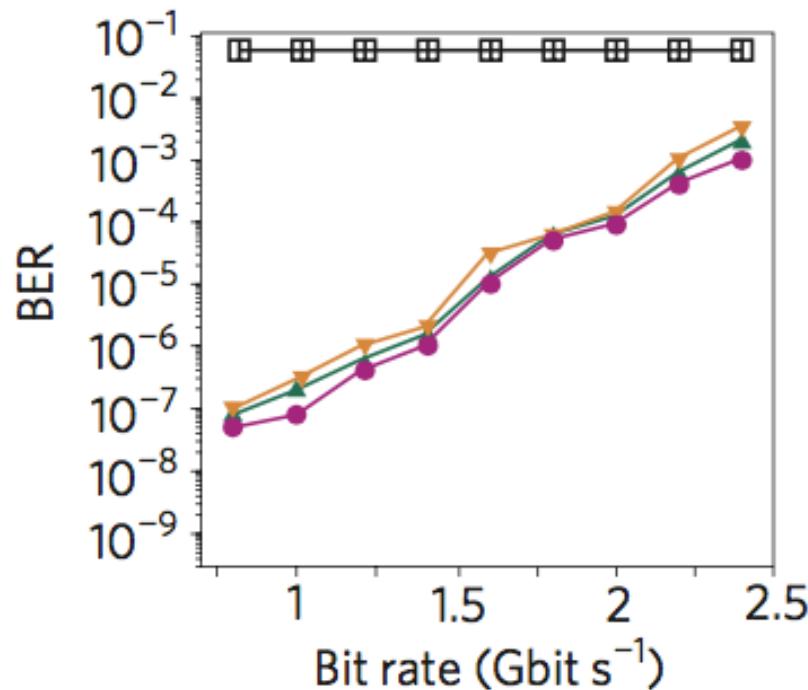
- Diode lasers allow fiber optic chaos communication systems with high data rates (oscillation frequency)
- Possible extension to atmospheric free-space communications using quantum cascade lasers



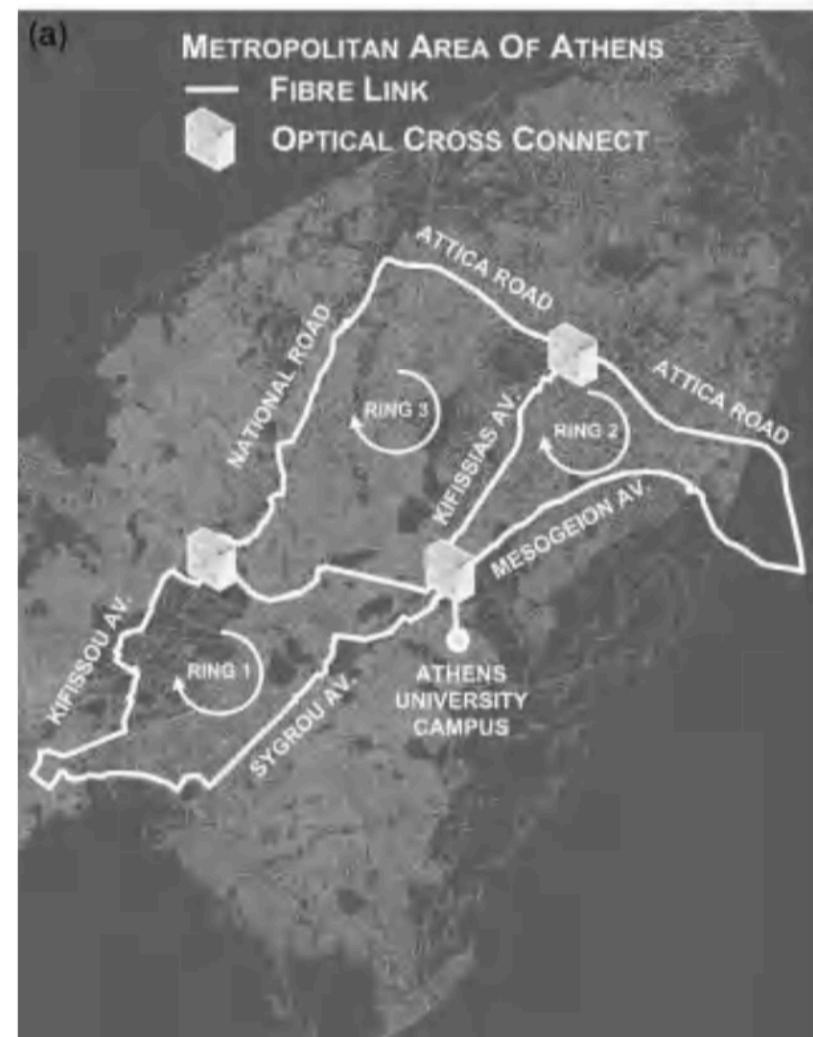
**By spreading the narrow band signal into a wideband signal, chaos-based communications can both create desired jamming and avoid malicious jamming**

# Private communications

- The optical chaos-covered signal was transmitted over a 120 km distance in a commercial optical network over the metropolitan area of Athens



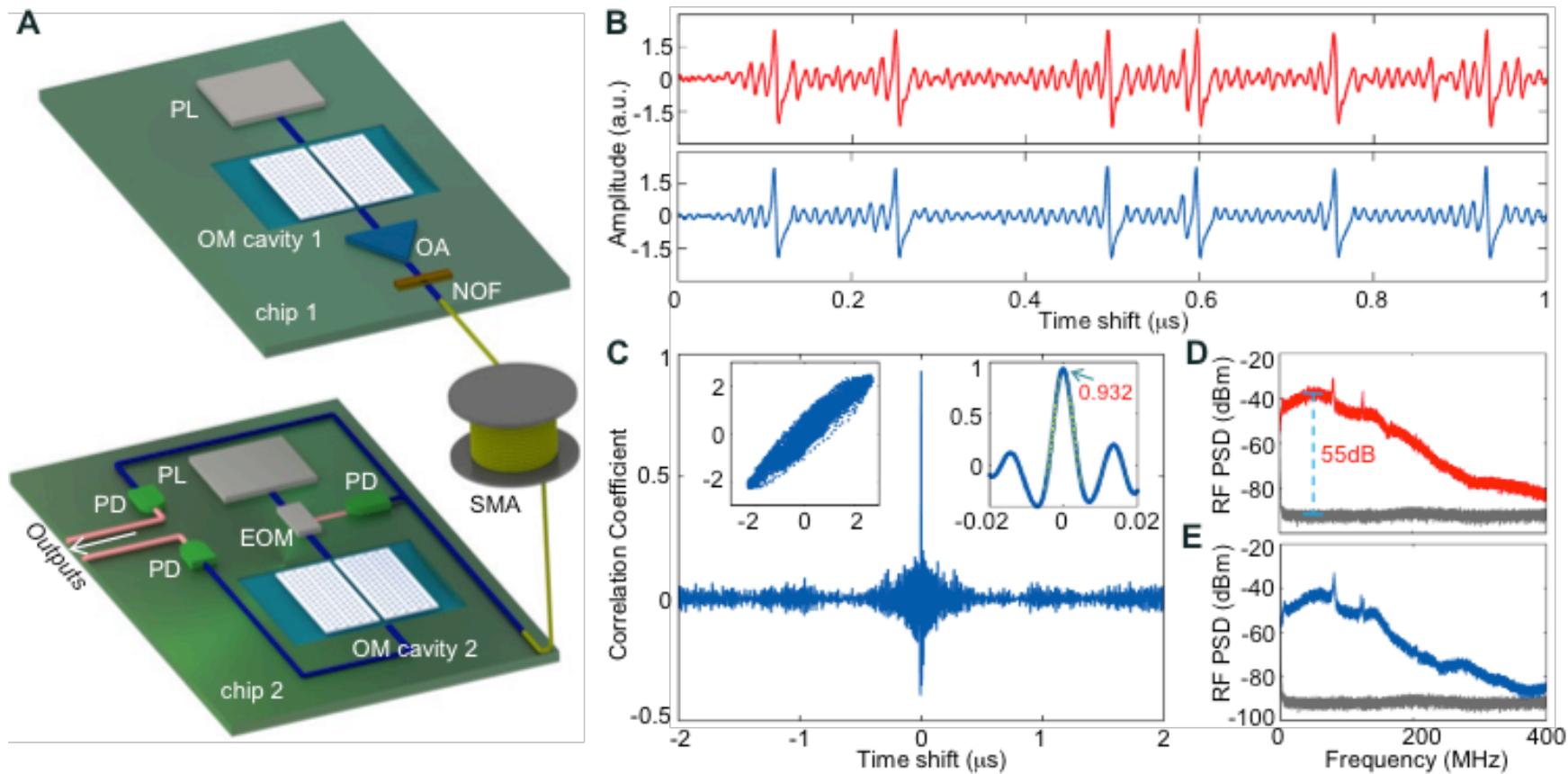
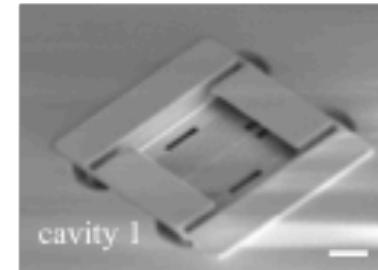
- Encoded back-to-back, code length  $2^7-1$
- Decoded back-to-back, code length  $2^7-1$
- ▲ Decoded long-distance, code length  $2^7-1$
- ▼ Decoded long-distance, code length  $2^{23}-1$

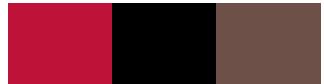


Argyris, A. et al., Nature vol. 438, pp. 343–346 (2005)

# On-chip private communications

- Optomechanical chaos with silicon microcavities
  - Made with photonics crystals
  - Integrable on a photonics circuit



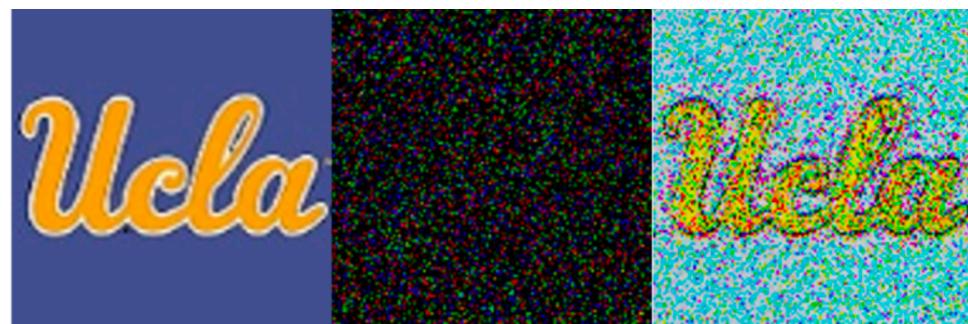
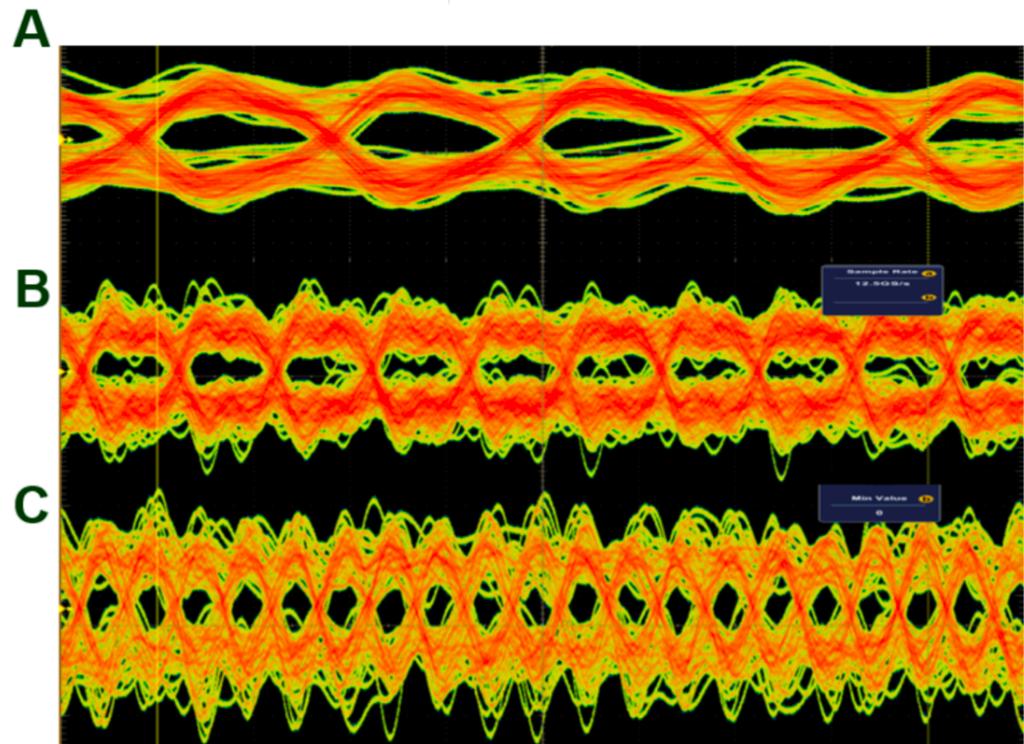


# On-chip private communications

Eye diagram of decrypted  
0.5 Mbit/s digital message

Eye diagram of decrypted  
1 Mbit/s digital message

Eye diagram of decrypted  
2 Mbit/s digital message



Encrypted      Decrypted

Test image with the logo of  
University of California Los Angeles  
(UCLA)

# Private communications

- Privacy in chaos communications results from the fact that an eavesdropper must have the proper hardware and parameter settings in order to decode and recover the message
- In conventional encryption techniques, a key is used to alter the symbols used for conveying information. Tx/Rx share a key so that the information can be recovered
- The key in chaos communication is a set of parameter values as well as similar hardware structure that are required for chaos synchronization and cancelation. The key is static even if a time-varying chaotic carrier is used

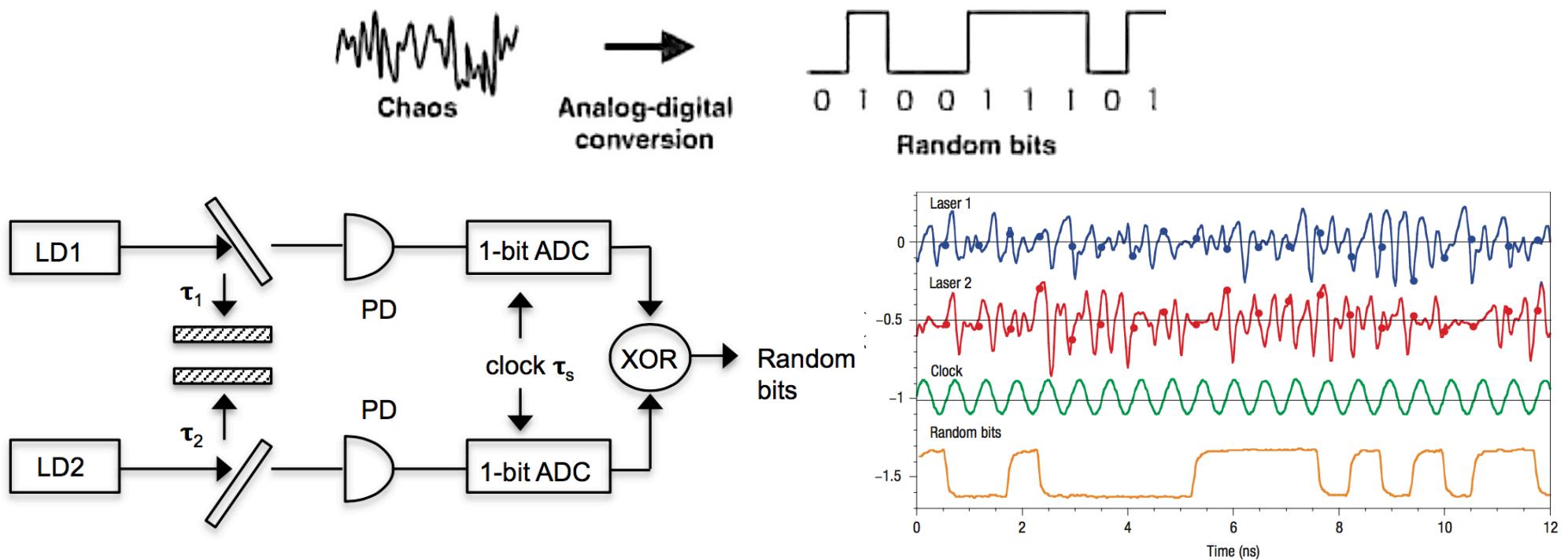


**The two important factors for privacy considerations in chaos communication are the dimensionality of the chaos and the effort required to obtain the necessary parameters for a matched Rx**

Y. Hong et al., Power loss resilience and eavesdropper detection in optical chaos communications systems, SPIE Photonics Europe. Vol. 7720, 77200J-1 (2010)

# Randomness, extraction, distillation

- A chaotic signal of laser output is detected by a photo-detector and converted to a binary digital signal by an analog-to-digital converter (ADC)
- The ADC converts the input analog signal into a binary digital signal by comparing with the threshold voltage

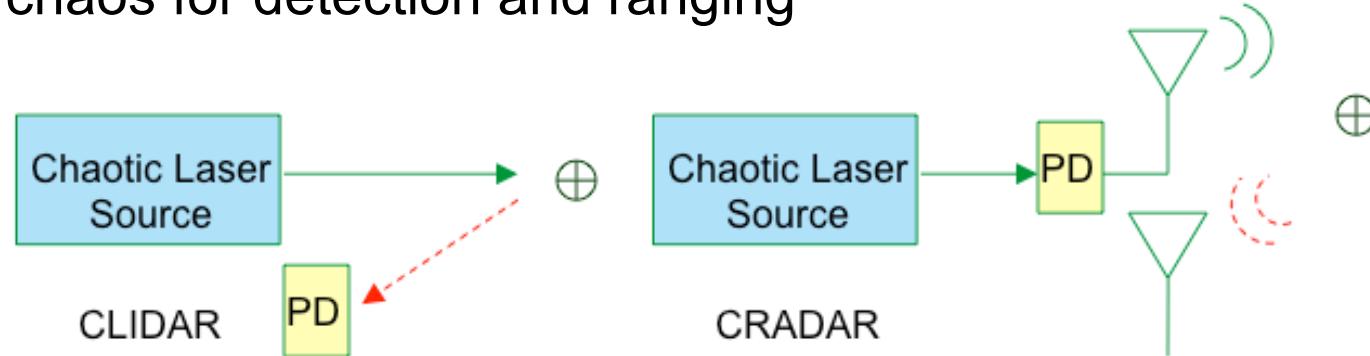


M. Sciamanna and K. A. Shore, Nature Photonics, Vol. 9, p. 151 (2015)



# *Detection and ranging*

## ■ Optical chaos for detection and ranging



- Chaotic lidar (CLIDAR) is a lidar system that uses chaotic light directly as the light source for detections
- Chaotic radar (CRADAR) is a radar system that uses chaotic microwave waveforms converted from chaotic light radiating and receiving by antennas for detections

**Their sources are the same → chaotic laser**

**Their principles are similar → correlation**

F.-Y. Lin and J.-M. Liu, IEEE J. Sel. Top. Quantum Electron., vol. 10, pp. 991, (2004)

# *Detection and ranging*

## ■ Applications of Lidars

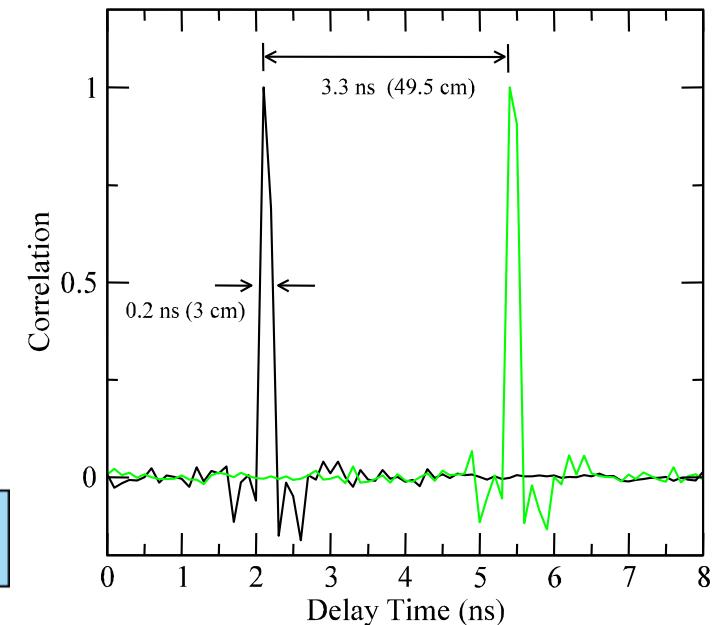
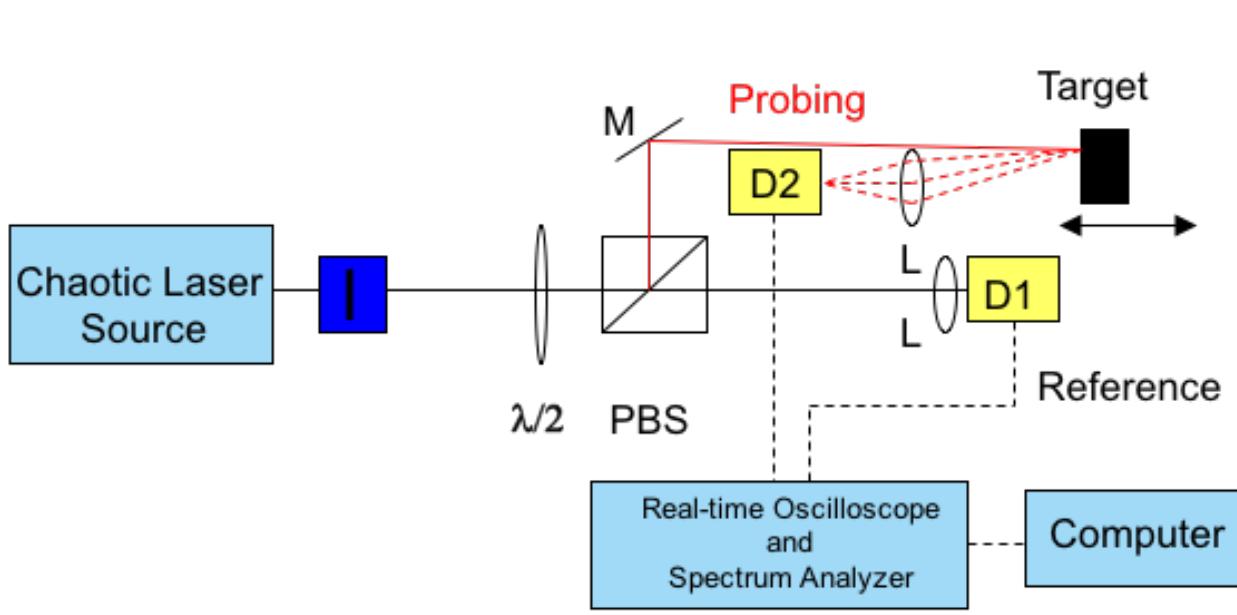
- range finding
- traffic safety monitoring
- target identification and recognition
- wind/speed detection
- atmosphere monitoring
- gas/aerosol composition/distribution detection
- pollution detection
- fire/volcano monitoring
- Self-driving cars

	CLIDAR
SNR	Low
Size	Compact
Weight	Portable
Cost	Cheap
Maintenance	Easy
Eye-safety	Safer
Efficiency	High
Electronics needed	None (chaos is self-generated by semiconductor lasers)
Detection range	Unlimited
Resolution	Excellent

F.-Y. Lin et al., Optics Express, vol. 26, p. 12230, (2018)

# Detection and ranging

- Detection is performed by correlating the signal waveform reflected or backscattered from the target with a delayed reference waveform
- 1 cm resolution for targets at 2 m distance
- Resistant to noise and jamming



F.-Y. Lin and J.-M. Liu, IEEE J. Sel. Top. Quantum Electron., vol. 10, pp. 991, (2004)

F.-Y. Lin et al., Optics Express, vol. 26, p. 12230, (2018)