



Article Hyperchaos, Intermittency, Noise and Disorder in Modified Semiconductor Superlattices

Luis L. Bonilla ^{1,2,*}, Manuel Carretero ^{1,2} and Emanuel Mompó ^{1,3}

- ¹ Gregorio Millán Institute for Fluid Dynamics, Nanoscience and Industrial Mathematics, Universidad Carlos III de Madrid, 28911 Leganés, Spain
- ² Department of Mathematics, Universidad Carlos III de Madrid, 28911 Leganés, Spain
- ³ Departamento de Matemática Aplicada, Universidad Pontificia Comillas, 28015 Madrid, Spain
- * Correspondence: bonilla@ing.uc3m.es

Abstract: Weakly coupled semiconductor superlattices under DC voltage bias are nonlinear systems with many degrees of freedom whose nonlinearity is due to sequential tunneling of electrons. They may exhibit spontaneous chaos at room temperature and act as fast physical random number generator devices. Here we present a general sequential transport model with different voltage drops at quantum wells and barriers that includes noise and fluctuations due to the superlattice epitaxial growth. Excitability and oscillations of the current in superlattices with identical periods are due to nucleation and motion of charge dipole waves that form at the emitter contact when the current drops below a critical value. Insertion of wider wells increases superlattice excitability by allowing wave nucleation at the modified wells and more complex dynamics. Then hyperchaos and different types of intermittent chaos are possible on extended DC voltage ranges. Intrinsic shot and thermal noises and external noises produce minor effects on chaotic current oscillations. Numerical simulations show that more than 70% of samples remain chaotic when the standard deviation of their fluctuations due to epitaxial growth is below 0.024 nm (10% of a single monolayer) whereas for 0.015 nm disorder suppresses chaos.

Keywords: semiconductor superlattices; nonlinear electron transport; chaos; hyperchaos; intermittency; chaos design; fluctuations; fast true random number generators; secure communications; chaotic devices

1. Introduction

Semiconductor superlattices (SSLs) are artificial crystals made out of a regular periodic array of layers of two different semiconductors stacked on top of each other [1–5]. These semiconductors have different band gaps and similar lattice constants, so that the conduction band edge of an infinitely long ideal SSL is a succession of quantum wells (QWs) and quantum barriers (QBs). When the latter are wide enough, QWs are weakly coupled and the resulting SSL behaves as an excitable or oscillatory system depending on its configuration [5]. Excitability and self-sustained oscillations involve the generation of charge dipole waves inside the SSL and their motion [5]. Devices made out of SSLs include oscillators [6–9], detectors [10–13], quantum cascade lasers [5,14–19], and all-electronic fast generators of true random numbers [20,21]. The latter are crucial to secure fast and safe data storage and transmission [22-24], stochastic modeling [25], and Monte Carlo simulations [26]. The origin of randomness for true random number generators based on SSLs is quantum partition noise due to electron tunneling [27–29]. However, the unpredictability of the final number sequence is due to chaotic evolution (described by deterministic model equations), which amplifies a random quantum seed into a fast process that achieves generation rates up to hundreds of Gb/s. SSL devices are smaller and more scalable than similarly fast optoelectronic devices based on random semiconductor lasers [30-34]. In



Citation: Bonilla, L.L.; Carretero, M.; Mompó, E. Hyperchaos, Intermittency, Noise and Disorder in Modified Semiconductor Superlattices. *Entropy* **2022**, *24*, 1702. https://doi.org/10.3390/e24121702

Academic Editor: Jiří Petržela

Received: 31 October 2022 Accepted: 19 November 2022 Published: 22 November 2022

Publisher's Note: MDPI stays neutral with regard to jurisdictional claims in published maps and institutional affiliations.



Copyright: © 2022 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). these devices, chaotic processes in the laser amplify quantum noise, which is the origin of randomness. Most of the unpredictability of the final random number sequence rests on chaotic evolution, which is deterministic. In a sense, random SSLs and semiconductor lasers work as physical pseudorandom number generators that take a random quantum seed and expand these small fluctuations at the quantum level into a fast changing physical process that achieves generation rates up to hundreds of Gb/s.

While early experiments observed chaos in GaAs/AlAs SSLs at ultralow temperatures [35,36], spontaneous current oscillations, quasiperiodic attractors and chaos have been observed at room temperature in GaAs/Al_{0.45}Ga_{0.55}As SSLs [37]. External noise may induce or enhance chaotic oscillations over a wider voltage bias range provided its amplitude is sufficiently large and its bandwidth is much smaller than the oscillation frequency [38]. Appropriate external noise of sufficient strength can induce self-sustained oscillations in an otherwise stationary state (coherence resonance [39–43]) and help detecting a superimposed weak periodic signal by stochastic resonance [13,44]; see also Refs. [45–50] for stochastic resonance.

To achieve a better understanding and control of SSL based random number generators, we need to improve our theoretical explanations of spontaneous chaos at room temperature. SSLs are nonlinear systems with many degrees of freedom, whose effective nonlinearity originates from the well-to-well sequential resonant tunneling process [5,51–54]. Most sequential tunneling models of electron transport consider *ideal* SSLs with identical periods [5,54–56]. Numerical simulations of ideal SSLs have shown that spontaneous chaos exists on narrow intervals of voltage bias and it is enhanced by noise [38,57,58]. Moreover, short SSLs at room temperature display clear period-doubling cascades to chaos, which occur on shorter voltage intervals for longer SSLs [59]. Period-doubling routes to spontaneous chaos at ultralow temperatures were predicted earlier [60,61]. Random imperfections strongly affect spontaneous chaos in SSLs [59]. Overall, spontaneous chaos predicted by numerical simulations of ideal SSLs exists on shorter voltage interval than reported in experiments.

More recently, we have put forward the idea that a systematic modification of SSL design produces more robust spontaneous chaos at room temperature [21]. The idea is to *design appropriate imperfections* in SSLs by inserting two identical and wider QWs in the SSL. In ideal SSLs, self-sustained current oscillations are due to repeated generation of dipole waves at the emitter contact and motion through the SSL to the collector contact. We show that inserting one wider QW may trigger dipole waves in it. In turn, complex dynamics arises out of the competition of two identical wider QWs as nucleation sites of dipole waves. We find hyperchaos, chaos with more than one positive Lyapunov exponent, and intermittent chaos due to random triggering of dipole waves. The connection of Lyapunov exponents to the Kolmogorov–Sinai metric entropy can be found in Refs. [62,63]; see also Ref. [64] for its generalization and use in statistical analysis of time series. We also study the effect of imperfections and noise on this design of chaotic SSLs and show that it is robust.

The rest of the paper is organized as follows. We describe the deterministic version of our microscopic sequential model of ideal SSL electron transport in Section 2 and Appendix A. Since we want our model to be realistic, we use a detailed model with different effective masses and voltage drops at wells and barriers [65–67]. Section 3 discusses the I - V current–voltage characteristic curve of an ideal SSL based on this model. For appropriate values of the emitter contact conductivity and other parameters, self-sustained oscillations of the current appear for a certain interval of bias voltages. In Section 4, we study the changes on the model equations due to having imperfect barriers and wells with varying widths and to internal and external noise. In Section 5, we include a single wider well or two wider wells in a SSL and study the resulting changes on the SSL current– voltage characteristics by numerical simulations of the deterministic equations. Details of hyperchaos and intermittent chaos are given in Section 6. For designing chaotic SSLs, it is important to study the influence of noise and randomness in the obtained enhanced spontaneous chaos. This is done in Section 7. The last section contains the summary and conclusions of this work.

2. Microscopic Sequential Tunneling Model

Commonly used models of electron transport in SSLs based on sequential tunneling are reviewed in Refs. [5,54–56,58]. Experimental confirmation in weakly coupled SSLs is abundantly documented in Ref. [5]. In sequential resonant tunneling models, each SSL period is described by average values of the electric field and electron density. The effective masses and permittivities of the different materials comprising the SSL are replaced by average values. The resulting models are discrete in space. The importance of using spatially discrete equations was recognized in early models, which were motivated by the formation of stationary electric field domains in SSLs [68–72]. In this paper, we treat the barriers and wells as separate entities [67,73], seeking a less symmetric representation of the SSL that may give a more complete and realistic description of electron transport and spontaneous chaos. The resulting model is more complete than those considered in these previous works [67,73].

2.1. Rate Equations for Subband Populations

The main charge transport mechanism in a weakly coupled SL is sequential resonant tunneling. We assume that the intrasubband scattering time is much shorter than the intersubband scattering time which, in turn, is much shorter than the interwell tunneling time across barriers. Typically, the time scale for carrier thermalization within a subband is 0.1 ps, the carriers reach thermal equilibrium with the lattice in times smaller than 100 ps, the tunneling time is about 500 ps and the time scale associated with self-sustained oscillations of the current is longer than 10 ns [72]. In processes varying on the latter scale, there is a local equilibrium Fermi–Dirac distribution at each subband v = 1, ..., n at the lattice temperature (for the numerical parameters used in numerical simulations, n = 3) with 2D electron densities $n_i^{(v)}$ related to their chemical potentials $\mu_i^{(v)}$ by [54]

$$n_i^{(\nu)} = \frac{m_W k_B T}{\pi \hbar^2} \int_0^\infty A_{C\nu}(\epsilon) \ln\left(1 + e^{(\mu_i^{(\nu)} - \epsilon)/k_B T}\right) d\epsilon.$$
(1)

Here i = 1, ..., N, where N is the number of SL periods. For the time being, we assume that all SL periods $d_B + d_W$ (d_B and d_W are the widths of barrier and wells, respectively) are identical (otherwise we have to label the widths of barriers and wells with indices) and that the electron temperature at each subband v of energy \mathcal{E}_{Cv} (measured from the bottom of the *i*th well) equals the lattice temperature T. m_W and k_B are the electron effective mass at the wells and the Boltzmann constant, respectively. Scattering is included in our model by means of Lorentzian functions:

$$A_{C\nu}(\epsilon) = \frac{\gamma_{\nu}}{\pi} \frac{1}{(\epsilon - \mathcal{E}_{C\nu})^2 + \gamma_{\nu}^2}$$
(2)

(for the *i*th well). The Lorentzian half-width is $\gamma_{\nu} = \hbar/\tau_{sc}$, where τ_{sc} is the lifetime associated to any scattering process dominant in the sample (interface roughness, impurity scattering, phonon scattering...) [73,74]. Of course this phenomenological treatment of scattering could be improved by calculating microscopically the self-energy associated to one of the scattering processes mentioned above [75,76], or even exchange-correlation effects (which affect the electron charge distribution in a self-consistent way). However restricting ourselves to a single scattering mechanism would result in a loss of generality and simplicity of the model. The electronic states of a SSL with infinite lateral extension have wave functions $e^{iqx+i\mathbf{k}_{\perp}\cdot\mathbf{x}_{\perp}}u_q(x)$ (a plane wave on the lateral directions $\mathbf{x}_{\perp} = (y, z)$ times a Bloch state on the direction of the superlattice vertical growth; $u_q(x)$ is a periodic

function of *x* with the SSL period). The energy minibands $\epsilon(q)$ corresponding to the previous Bloch states solve a 1D Kronig–Penney model [77,78]

$$\cos ql = \cos kd_W \cosh \alpha d_B - \frac{1}{2} \left(\frac{1}{\xi} - \xi\right) \sin kd_W \sinh \alpha d_B, \tag{3a}$$

$$k = \frac{\sqrt{2m_W\varepsilon}}{\hbar}, \quad \alpha = \frac{\sqrt{2m_B(eV_B - \epsilon)}}{\hbar}, \quad \xi = \frac{m_W\alpha}{m_Bk} = \sqrt{\frac{m_W}{m_B}\left(\frac{eV_B}{\epsilon} - 1\right)}.$$
 (3b)

In the limit as $\alpha d_B \to \infty$, Equation (3a) produces the subbands $\epsilon = \mathcal{E}_{C\nu}$ appearing in Equation (2):

$$\cos kd_W - \frac{1}{2}\left(\frac{1}{\xi} - \xi\right)\sin kd_W = 0, \tag{4}$$

where *k* is given by Equation (3b). Using the symmetry of the quantum well [77], Equation (4) factorizes into two equations corresponding to even and odd wave functions, respectively:

$$\cos\frac{kd_W}{2} - \frac{1}{\xi}\sin\frac{kd_W}{2} = 0, \quad \cos\frac{kd_W}{2} + \xi\sin\frac{kd_W}{2} = 0$$

We shall write the rate equations for the electron densities and n = 3 to simplify the number of tunneling channels:

$$\dot{n}_{i}^{(1)} = \frac{1}{e} [J_{1,i-1\to 1,i} - J_{1,i\to 1,i+1} - J_{1,i\to 2,i+1} - \dots - J_{1,i\to n,i+1}] + \frac{n_{i}^{(2)}}{\tau_{21}} + \dots + \frac{n_{i}^{(n)}}{\tau_{n1}},$$
(5a)

$$\dot{n}_{i}^{(2)} = \frac{1}{e} [J_{1,i-1\to 2,i} - J_{2,i\to 3,i+1}] - \frac{n_{i}^{(2)}}{\tau_{21}},$$
(5b)

$$\dot{n}_{i}^{(3)} = \frac{1}{e} [J_{1,i-1\to n,i} + J_{2,i-1\to 3,i+1}] - \frac{n_{i}^{(3)}}{\tau_{31}},$$
(5c)

where τ_{21} , τ_{31} are the intersubband scattering times within a quantum well, -e < 0 is the charge of the electron, and $J_{\nu,i\rightarrow\nu',i+1}$ is the current density from subband ν of QW *i* to subband ν' of QW *i* + 1. The current densities may be approximately calculated by means of the Transfer Hamiltonian method [79–85]. It is important to note that the current densities are functions of the local electric field that exhibit several peaks when all the electron densities equal the doping density [5,54]. See details in Appendix A; here we only quote the results [54,67].

2.2. Tunneling Current

Let $J_{1,i \rightarrow \nu,i+1}$ be the tunneling current through the *i*th barrier from the first subband of QW *i* to the ν th subband of QW *i* + 1. As explained in Appendix A, we have [54,58]

$$J_{1,i \to \nu,i+1} = \frac{e\hbar k_B T}{2m_B} \int_0^\infty A_{C1}(\epsilon) A_{C\nu} \Big(\epsilon + eV_i + \frac{e}{2} (V_{w_i} + V_{w_{i+1}}) \Big) B_{i-1,i}(\epsilon) \\ \times B_{i,i+1}(\epsilon) T_i(\epsilon) \ln \Bigg[\frac{1 + e^{\frac{\mu_i^{(1)} - \epsilon}{k_B T}}}{1 + e^{\frac{\mu_{i+1}^{(1)} - eV_i - e(V_{w_i} + V_{w_{i+1}})/2 - \epsilon}{k_B T}} \Bigg] d\epsilon,$$
(6)

in which the energies ϵ are measured from the bottom of the *i*th well, and:

• $B_{i-1,i}$ are given by

$$B_{i-1,i} = k_i \left[d_W + \left(\frac{1}{\alpha_{i-1}} + \frac{1}{\alpha_i} \right) \left(\frac{m_B}{m_W} \sin^2 \frac{k_i d_W}{2} + \cos^2 \frac{k_i d_W}{2} \right) \right]^{-1},$$
(7a)

$$\hbar k_i = \sqrt{2m_W \epsilon}, \quad \hbar k_{i+1} = \sqrt{2m_W e \left(\frac{\epsilon}{e} + V_i + \frac{V_{w_i} + V_{w_{i+1}}}{2}\right)},\tag{7b}$$

$$\hbar\alpha_{i} = \sqrt{2m_{B}e\left(V_{B} - \frac{V_{w_{i}}}{2} - \frac{\epsilon}{e}\right)}, \quad \hbar\alpha_{i-1} = \sqrt{2m_{B}e\left(V_{B} + \frac{V_{w_{i}}}{2} + V_{i-1} - \frac{\epsilon}{e}\right)}, (7c)$$

$$\hbar \alpha_{i+1} = \sqrt{2m_B e \left(V_B - \frac{V_{w_i}}{2} - V_i - V_{w_{i+1}} - \frac{\epsilon}{e}\right)},\tag{7d}$$

where k_i and α_i are the wave numbers in the wells and the barriers, respectively, m_W and m_B are the effective masses of the electrons at the wells and barriers, respectively, and d_W and d_B are the widths of wells and barriers, respectively. $\hbar B_{i,i+1}/m_B$ are the attempt frequencies related to sequential tunneling through the *i*th barrier. V_i and V_{w_i} , i = 1, ..., N, are the potential drops at the *i*th barrier and well, respectively. We assume that the potential drops at barrier and wells are non-negative and that the electrons are singularly concentrated on a plane located at the end of each well. Then k_i (dictated by the Transfer Hamiltonian method, cf Appendix A) depends on the electric potential at the center of the *i*th well, whereas α_i depends on the potential at the beginning of the *i*th barrier, $V_{w_i}/2$. The potential drops V_0 and V_N correspond to the barriers separating the SL from the emitter and collector contacts, respectively. eV_B is the barrier height in the absence of potential drops.

• T_i is the dimensionless transmission probability through the *i*th barrier separating wells *i* and *i* + 1:

$$T_{i}(\epsilon) = \frac{1}{\frac{(k_{i}+k_{i+1})^{2}}{4k_{i}k_{i+1}} + \frac{1}{4} \left(\frac{m_{B}k_{i}}{m_{W}\alpha_{i}} + \frac{m_{W}\alpha_{i}}{m_{B}k_{i}}\right) \left(\frac{m_{B}k_{i+1}}{m_{W}\alpha_{i}} + \frac{m_{W}\alpha_{i}}{m_{B}k_{i+1}}\right) \sinh^{2}(\alpha_{i}d_{B})}.$$
(8)

2.3. Poisson Equations

The voltage drops through the structure are calculated as follows. The Poisson equation yields the potential drops in the barriers, V_i , and the wells, V_{wi} :

$$\varepsilon_W \frac{V_{w_i}}{d_W} = \varepsilon_B \frac{V_{i-1}}{d_B} + \frac{e}{2}(n_i - N_D), \quad n_i = \sum_{\nu=1}^n n_i^{(\nu)},$$
 (9a)

$$\varepsilon_B \frac{V_i}{d_B} = \varepsilon_B \frac{V_{i-1}}{d_B} + e(n_i - N_D), \quad i = 1, \dots, N,$$
(9b)

where ε_W and ε_B and N_D are the well and barrier static permittivities and the 2D intentional doping density at the wells, respectively [65–67,73].

2.4. Boundary Conditions

In Ref. [73], the boundary conditions consist of using the current densities of Equations (6)–(8) in an Ampère's law derived from Equations (5), together with a model of the emitter and collector layers and a simplified version of the metal semiconductor contact. In this work, we shall use simpler phenomenological Ohm laws for the current density at emitter and collector, namely

$$I_{0\to1} = \sigma_e \frac{V_0}{d_{B_0}},$$
 (10a)

$$J_{N \to N+1} = \sigma_c \frac{n_N}{N_{D_N}} \frac{V_N}{d_{B_N}}.$$
 (10b)

Here σ_j , j = e, c are the contact conductivities, d_{B_j} are effective lengths for the contact regions and N_{D_N} is an effective 2D doping density of the collector, cf. Ref. [54].

The condition of overall voltage bias between contacts closes the set of equations:

$$V_{dc} = \sum_{i=0}^{N} V_i + \sum_{i=1}^{N} V_{w_i}.$$
 (11)

2.5. Elimination of the Potential Drops at the Wells

The previous model gives rise to many equations but some of them are not independent. We can eliminate the potential drops at the wells from the system, as done in Ref. [73]. Equation (9) imply

$$\frac{\varepsilon_W V_{w_i}}{\varepsilon_B d_W} = \frac{V_{i-1} + V_i}{2d_B}, \quad i = 1, \dots, N.$$
(12)

Then the bias condition (11) becomes

$$V_{dc} = \left(1 + \frac{\varepsilon_B d_W}{\varepsilon_W d_B}\right) \sum_{i=0}^N V_i - \frac{\varepsilon_B (V_0 + V_N) d_W}{2\varepsilon_W d_B}.$$
 (13)

Instead of the rate Equation (5), we can derive a form of Ampère's law which explicitly contains the total current density J(t). We differentiate Equation (9b) with respect to time and eliminate $n_i = \sum_{\nu=1}^{3} n_i^{(\nu)}$ by using Equation (5). The result is

$$\frac{\varepsilon_B}{d_B}\frac{dV_i}{dt} + J_{i \to i+1} = J(t), \tag{14}$$

$$J_{i \to i+1} = \sum_{\nu=1}^{3} J_{1,i \to \nu,i+1} + J_{2,i \to 3,i+1},$$
(15)

where i = 0, 1, ..., N and the total current density J(t) is the sum of displacement and tunneling currents. If there are more than three subbands, Equation (15) will include more contributions from other tunneling channels.

2.6. Elimination of the Higher Subband Populations

Typically τ_{21} and τ_{31} in Equation (5) are much smaller than the dielectric relaxation time. Then Equations (5b) and (5c) have the quasi-stationary solutions

$$n_i^{(2)} \approx \frac{\tau_{21}}{e} J_{1,i-1 \to 2,i}, \dots, \quad n_i^{(n)} \approx \frac{\tau_{n1}}{e} J_{1,i-1 \to n,i},$$
 (16)

and $n_i^{(2)}, \ldots, n_i^{(n)} \ll n_i^{(1)}$. Then we can set $n_i^{(2)} = \ldots = n_i^{(n)} = 0$, $n_i^{(1)} = n_i$, $\mu_i^{(1)} = \mu_i$, given by Equation (1),

$$n_{i} = \frac{m_{W}k_{B}T}{\pi\hbar^{2}} \int_{0}^{\infty} A_{C_{1}}(\epsilon) \ln\left(1 + e^{(\mu_{i}-\epsilon)/k_{B}T}\right) d\epsilon, \qquad (17)$$

 $\mu_i^{(\nu)} \to -\infty$ for $\nu \neq 1$, and Equation (15) becomes

$$J_{i\to i+1} = J_{i\to i+1}^+(V_{i-1}, V_i, V_{i+1}, \mu_i, T) - J_{i\to i+1}^-(V_{i-1}, V_i, V_{i+1}, \mu_{i+1}, T),$$
(18)

where

$$J_{i \to i+1}^{+} = \frac{e\hbar k_{B}T}{2m_{B}} \sum_{\nu=1}^{n} \int_{0}^{\infty} A_{C_{1}}(\epsilon) A_{C_{\nu}} \left(\epsilon + eV_{i} + \frac{ed_{W}\varepsilon_{B}}{4d_{B}\varepsilon_{W}}(V_{i-1} + V_{i+1} + 2V_{i})\right) \times B_{i-1,i}(\epsilon) B_{i,i+1}(\epsilon) T_{i}(\epsilon) \ln\left(1 + e^{\frac{\mu_{i}-\epsilon}{k_{B}T}}\right) d\epsilon,$$

$$J_{i \to i+1}^{-} = \frac{e\hbar k_{B}T}{2m_{B}} \int_{0}^{\infty} A_{C_{1}}(\epsilon) A_{C_{1}} \left(\epsilon + eV_{i} + \frac{ed_{W}\varepsilon_{B}}{4d_{B}\varepsilon_{W}}(V_{i-1} + V_{i+1} + 2V_{i})\right) B_{i-1,i}(\epsilon) \times B_{i,i+1}(\epsilon) T_{i}(\epsilon) \ln\left[1 + \exp\left(\frac{1}{k_{B}T}\left(\mu_{i+1} - \epsilon - eV_{i} - ed_{W}\varepsilon_{B}\frac{V_{i-1} + V_{i+1} + 2V_{i}}{4d_{B}\varepsilon_{W}}\right)\right)\right] d\epsilon.$$
(19a)
$$(19a)$$

Since all tunneling currents from subbands with $\nu > 1$ are negligible, Equation (19) hold for any number of subbands, not only for n = 3. These equations differ from the usual sequential tunneling model that includes a sum over higher subbands in Equation (19b).

The time-dependent model consists of the 3N + 2 Equations (9b), (13), (14), (17) [the currents are given by Equations (18) and (19)], which contain the 3N + 2 unknowns n_j , μ_j (j = 1, ..., N), V_j (j = 0, 1, ..., N), and J. Thus we have a system of equations which, together with appropriate initial conditions, determine completely and self-consistently the voltage drops, current density, and electron densities. For convenience, let us list again the minimal set of equations we need to solve in order to determine completely all the unknowns:

$$\frac{\varepsilon_B}{d_B} \frac{dV_i}{dt} + J_{i \to i+1} = J(t), \qquad i = 0, 1, \dots, N,$$
(20a)

$$\varepsilon_B \frac{V_i}{d_B} = \varepsilon_B \frac{V_{i-1}}{d_B} + e(n_i - N_D), \quad i = 1, ..., N,$$
 (20b)

$$n_{i} = \frac{m_{W}k_{B}T}{\pi\hbar^{2}} \int_{0}^{\infty} A_{C1}(\epsilon) \ln\left(1 + e^{(\mu_{i}-\epsilon)/k_{B}T}\right) d\epsilon, \quad i = 1, \dots, N,$$
(20c)

$$V_{dc} = \left(1 + \frac{\varepsilon_B d_W}{\varepsilon_W d_B}\right) \sum_{i=0}^N V_i - \frac{\varepsilon_B d_W}{2\varepsilon_W d_B} (V_0 + V_N),$$
(20d)

together with the constitutive relations given by Equations (10), (18) and (19).

3. Current-Voltage Characteristics and Attractors for Ideal SSL

In this section, we review the different stable configurations that may appear in ideal SSLs with identical periods described by Equations (20) and (18), (19).

Our basic SSL configuration is that of References [20,37]: An ideal SSL with N = 50 periods whose three relevant subband energies, 41.6, 165.8, and 354.3 meV, are calculated by means of Equation (8). The level broadenings due to scattering are 2.5, 8 and 24 meV, respectively, for the three subbands involved in the I - V characteristics we study [21]. The equivalent 2D doping density due to the doping of the central part of the quantum well is $N_D = 6 \times 10^{10}$ cm⁻². Furthermore, $m_W = 0.063 m_e$, $m_B = (0.063 + 0.083x)m_e = 0.1m_e$ (for x = 0.45), $A = s^2$ with $s = 30 \,\mu\text{m}$, $d_B = 4 \,\text{nm}$, $d_W = 7 \,\text{nm}$, $l = d_B + d_W$, $\varepsilon_B = 10.9\varepsilon_0$, $\varepsilon_W = (12.9 - 2.84x)\varepsilon_0$, ε_0 , and V_{dc} are the effective electron mass at wells and barriers, the SL cross section, the side length of a square mesa, the (Al,Ga)As barrier thickness, the GaAs well thickness, the SL period, the barrier permittivity, the well permittivity, the dielectric constant of the vacuum, and the DC voltage bias, respectively. We select contact conductivities $\sigma_c = \sigma_e = 0.49 \text{ A/Vm}$ and the same doping density N_D for injector and collector.

The current–voltage I - V curve of the SSL gives an overall picture of the different stable configurations thereof as a function of the applied *DC* voltage *V*, which acts as a control parameter. The I - V curve has regions of increasing current separated by almost plateaus between them. The regions of increasing current roughly correspond to subband energies of Equation (8) counted from the first one, $(\mathcal{E}_{Cv} - \mathcal{E}_{C1})/e$, and the plateaus to the

intervals between them. Figure 1 shows the first plateau. For this ideal SSL, the current increases linearly from zero voltage (not shown) until it reaches the first plateau. The stable solution of Equation (20) with boundary conditions (10) is time independent except for a voltage region of time-periodic solutions whose maxima and minima and average current are marked in Figure 1a,b. The stationary solutions at the plateau are frozen wavefronts that increase with QW index from a low to a high value of the voltage drops V_i (which equal the local electric field). In the limit of an infinitely long SSL, $J_{i\rightarrow i+1} = J$ for $n_i = N_D$ and $V_i = F$ has three solutions $F^{(1)} < F^{(2)} < F^{(3)}$, and $F^{(1)}$ are the low and high field values, respectively. Depending on the value of the stationary current density J, a wavefront on the infinitely long SSL does not move (it is pinned by the lattice) or it moves with constant velocity [54,56]. For a SSL with finitely many periods, J is fixed by the bias condition Equation (20d) [5,54].



Figure 1. (a) First plateau of the current–voltage characteristics for the SSL with 50 identical periods. (b) Zoom of the region of self-oscillations that appear as a supercritical Hopf bifurcation and end at a SNIPER. V_d is the voltage at which the frequency of the oscillations drop to lower values. For $V_{dc} > V_d$, the high electric field domains move throughout the SSL and reach the collector contact. Current traces and the corresponding density plots of the electric field for (c) $V_{dc} = 0.26$ V (just after the Hopf bifurcation) and (d) $V_{dc} = 0.29$ V (just before the SNIPER bifurcation). Light and dark tones correspond to low and high field values, respectively.

The branch of time-periodic solutions exists provided the number of SSL periods is 14 or higher for the parameters of our SSL, cf Refs. [72,86,87] for theory on a simpler model. The branch of time-periodic solutions starts as a supercritical Hopf bifurcation and ends at a saddle-node infinite period (SNIPER) bifurcation, i.e., it ends at finite amplitude and infinite period by collision of the periodic attractor with a homoclinic orbit. The time-periodic self-sustained oscillations are caused by the repeated formation of dipole waves (traveling high-field domains) at the emitter, motion toward and annihilation at the collector, as seen in Figure 1c,d for voltages near the beginning (Hopf) and end (SNIPER) of their voltage region. Figure 1c,d show current traces and the corresponding density plot of the electric field inside the SSL. Near the Hopf bifurcation, the high-field domains are repeatedly born at the emitter contact and die before reaching the collector contact as seen in Figure 1c, which produces high-frequency oscillations. For $V_{dc} > V_d$, the domains reach the collector

as seen in Figure 1d, and the oscillation frequency drops. The frequency vanishes at the SNIPER bifurcation.

Figure 2 contains the phase diagram of the emitter contact σ_e of Equation (10a) as a function of V_{dc} . We observe that self-sustained oscillations are possible in a region of the parameter plane (V_{dc} , σ_e). Below a certain σ_e , self-sustained oscillations begin and end with Hopf bifurcations, whereas for larger contact conductivity, they end at a SNIPER bifurcation, cf Figure 1. We have adopted a value in the latter region because it produces results compatible with experiments.



Figure 2. Phase diagram of injector contact conductivity versus DC voltage exhibiting a bounded region of current self-oscillations. At the dashed boundary line, the self-oscillations appear as Hopf bifurcations from the stationary field profile which is linearly stable outside the bounded region. The continuous boundary line corresponds to oscillations disappearing at a saddle-node infinite period bifurcation, as selected in the main text. In the red regions, self-oscillations have low frequency and correspond to fully formed charge dipole waves that move across the entire SSL. In the blue regions, high frequency self-oscillations correspond to charge dipole waves that disappear before reaching the receiving contact. Reprinted from [21].

4. Noise, Imperfections and Superlattice Configurations

4.1. Stochastic Equations

Internal and external noises can be included in our model as indicated in Ref. [58]. We add noise terms to Equations (20a) and (20d),

$$\frac{\varepsilon_B}{d_B}\frac{dV_i}{dt} + J_{i\to i+1} + \xi_i(t) = J(t), \quad i = 0, \dots, N,$$
(21)

$$V_{dc} = \left(1 + \frac{\varepsilon_B d_W}{\varepsilon_W d_B}\right) \sum_{i=0}^N V_i - \frac{\varepsilon_B d_W}{2\varepsilon_W d_B} (V_0 + V_N) + \eta(t),$$
(22)

keeping the other equations unchanged and including a voltage fluctuation $\eta(t)$ [44]. The fluctuations of the current density are independent identically distributed (i.i.d.) zero-mean white noises with correlations:

$$\langle \xi_{i}(t)\xi_{j}(t')\rangle = \frac{e}{A} \Big[J_{i\to i+1}^{+}(V_{i-1}, V_{i}, V_{i+1}, \mu_{i}, T) + J_{i\to i+1}^{-}(V_{i-1}, V_{i}, V_{i+1}, \mu_{i+1}, T) \\ + 2k_{B}T \frac{\partial}{\partial \mu_{i}} J_{i\to i+1}^{-}(V_{i-1}, V_{i}, V_{i+1}, \mu_{i}, T) \Big] \delta_{ij}\delta(t-t').$$

$$(23)$$

We have assumed that the internal noise is due to shot and thermal noise [27]. The first two terms in the right hand side of Equation (23) are due to shot noise [27] and the last

one to thermal fluctuations. We model current fluctuations associated to dissipation due to electron diffusion by Landau–Lifshitz fluctuating hydrodynamics [88,89] adapted to SSLs. Equation (18) can be written as a discrete drift-diffusion current density,

$$J_{i \to i+1} = J_{i \to i+1}^+ (V_{i-1}, V_i, V_{i+1}, \mu_i, T) - J_{i \to i+1}^- (V_{i-1}, V_i, V_{i+1}, \mu_i, T) - [J_{i \to i+1}^- (V_{i-1}, V_i, V_{i+1}, \mu_{i+1}, T) - J_{i \to i+1}^- (V_{i-1}, V_i, V_{i+1}, \mu_i, T)],$$
(24)

where the last two terms correspond to electron diffusion [58]. Considered as a function of the chemical potential and fixing the voltage drops, this discrete diffusion yields

$$\delta[J_{i\to i+1}^-(\mu_{i+1}) - J_{i\to i+1}^-(\mu_i)] \approx \frac{\partial J_{i\to i+1}^-(\mu_i)}{\partial \mu_i} \,\delta(\mu_{i+1} - \mu_i)$$

Then the fluctuations of the current density are i.i.d. zero-mean white noises with correlation given by the last term in Equation (23), cf. Ref. [89]. This is similar to fluctuations in Gunn diodes where the diffusion current is proportional to the diffusion coefficient times the electron density [89], instead of the nonlinear expression in Equation (23).

4.2. Non-Ideal Superlattices

Typically, there are doping density fluctuations at the wells, one-monolayer fluctuations of barrier and well widths and fluctuations in Al concentration at barriers. In addition, we may want to change the width of some wells and explore how the SSL dynamics changes. While it is clear that doping density fluctuations affect Poisson equations, the other fluctuations modify importantly the tunneling currents. Local changes in d_B , d_W , m_B , ε_B and V_B change the location of energy levels at each well, the barrier wave numbers α_i , and the coefficient functions B_i , T_i and A_{Cj} . Fluctuations in doping density, barrier and well width affect electrostatics and Ampère's law.

4.2.1. Electrostatics and Ampère's Law

Equations (9a) and (9b) become

$$\varepsilon_W \frac{V_{w_i}}{d_{W_i}} = \varepsilon_{B_{i-1}} \frac{V_{i-1}}{d_{B_{i-1}}} + \frac{e}{2}(n_i - N_{Di}),$$
 (25a)

$$\varepsilon_{B_i} \frac{V_i}{d_{B_i}} = \varepsilon_{B_{i-1}} \frac{V_{i-1}}{d_{B_{i-1}}} + e(n_i - N_{D_i}),$$
 (25b)

from which we obtain,

$$V_{w_i} = \frac{d_{W_i}}{2\varepsilon_W} \bigg(\varepsilon_{B_{i-1}} \frac{V_{i-1}}{d_{B_{i-1}}} + \varepsilon_{B_i} \frac{V_i}{d_{B_i}} \bigg).$$
(26)

The electron density of Equation (20d) becomes

$$n_{i} = \frac{m_{W}k_{B}T}{\pi\hbar^{2}} \int_{0}^{\infty} A_{C_{1_{i}}}(\epsilon) \ln\left(1 + e^{(\mu_{i} - \epsilon)/k_{B}T}\right) d\epsilon,$$
(27a)

$$A_{C_{\nu_i}}(\epsilon) = \frac{\gamma_{\nu}}{\pi} \frac{1}{(\epsilon - \mathcal{E}_{C_{\nu_i}})^2 + \gamma_{\nu}^2}.$$
(27b)

Ampère's law can be obtained in the same way as Equation (14). Now it is:

$$\frac{\varepsilon_{B_i}}{d_{B_i}}\frac{dV_i}{dt} + J_{i\to i+1} + \xi_i(t) = J(t).$$
(28)

The i.i.d. zero-mean white noises $\xi_i(t)$ have correlations given by Equation (23). The voltage bias condition of Equation (22) is now

$$V_{dc} = \sum_{i=0}^{N} \left(1 + \frac{d_{W_i} + d_{W_{i+1}}}{2\varepsilon_W d_{B_i}} \varepsilon_{B_i} \right) V_i - \frac{\varepsilon_{B_0} d_{W_0} V_0}{2\varepsilon_W d_{B_0}} - \frac{\varepsilon_{B_N} d_{W_{N+1}} V_N}{2\varepsilon_W d_{B_N}} + \eta(t).$$
(29)

The total current J(t) can be calculated from Equation (28) and the bias condition in Equation (29), thereby providing effective nonlocal equations of motion when substituted back in Equation (28).

4.2.2. Tunneling Currents

The disorder modifies the energy levels measured from the bottom of each well so that they depend on the well number and we denote them as \mathcal{E}_{Cj_i} . Barrier effective masses, permittivities, widths and wave numbers are also modified. The tunneling current densities given by Equation (19) become

$$J_{i \to i+1}^{+} = \frac{e\hbar k_B T}{2m_{B_i}} \sum_{\nu=1}^{3} \int_{0}^{\infty} A_{C_{1_i}}(\epsilon) B_{i-1,i}(\epsilon) B_{i,i+1}(\epsilon) T_i(\epsilon) \ln\left(1 + e^{\frac{\mu_i - \epsilon}{k_B T}}\right) \\ \times A_{C_{\nu_{i+1}}} \left(\epsilon + \left(1 + \frac{\epsilon_{B_i}}{d_{B_i}} \frac{d_{W_i} + d_{W_{i+1}}}{4\epsilon_W}\right) eV_i + \frac{d_{W_i} \epsilon_{B_{i-1}} eV_{i-1}}{4d_{B_{i-1}} \epsilon_W} + \frac{d_{W_{i+1}} \epsilon_{B_{i+1}} eV_{i+1}}{4d_{B_{i+1}} \epsilon_W}\right) d\epsilon, (30a)$$

$$J_{i \to i+1}^{-} = \frac{e\hbar k_B T}{2m_{B_i}} \int_{0}^{\infty} A_{C_{1_i}}(\epsilon) B_{i-1,i}(\epsilon) B_{i,i+1}(\epsilon) T_i(\epsilon) \\ \times A_{C_{1_{i+1}}} \left(\epsilon + \left(1 + \frac{\epsilon_{B_i}}{d_{B_i}} \frac{d_{W_i} + d_{W_{i+1}}}{4\epsilon_W}\right) eV_i + \frac{d_{W_i} \epsilon_{B_{i-1}} eV_{i-1}}{4d_{B_{i-1}} \epsilon_W} + \frac{d_{W_{i+1}} \epsilon_{B_{i+1}} eV_{i+1}}{4d_{B_{i+1}} \epsilon_W}\right) \\ \times \ln \left[1 + \exp\left(\frac{\mu_{i+1} - \epsilon}{k_B T} - \left(1 + \frac{\epsilon_{B_i}}{d_{B_i}} \frac{d_{W_i} + d_{W_{i+1}}}{4\epsilon_W}\right) \frac{eV_i}{k_B T} - \frac{d_{W_i} \epsilon_{B_{i-1}} eV_{i-1}}{4k_B T d_{B_{i-1}} \epsilon_W}\right)\right] d\epsilon, \tag{30b}$$

for i = 1, ..., N - 1.

5. *I* – *V* Characteristic Curves of Modified Superlattices

In this section, we ignore noise and fluctuations in doping density and in barrier and well widths. We discuss how introducing one or two wider wells changes the current–voltage characteristics I - V of an otherwise ideal SSL. Figure 1a,b show the I - V curve of the ideal SSL with appropriate emitter contact conductivity. It exhibits self-sustained oscillations of the current in a narrow voltage region provided the number of SSL periods is 14 or larger. These oscillations are periodic in time and are caused by the formation of traveling regions of high field (which are charge dipole waves) at the emitter, motion toward and annihilation at the collector; see Figure 1c,d. For the chosen value of σ_e , the branch of oscillations starts as a supercritical Hopf bifurcation and ends at a SNIPER bifurcation.

5.1. Effect of One Wider Well on the I - V Characteristics

What can we expect by modifying the width of a well in an otherwise ideal SSL? Let us consider the tunneling current of an ideal SSL for fixed electron densities $n_i = N_D$ and a constant barrier voltage drop V in Equation (18), $J_{i\rightarrow i+1}(V)$. Figure 3 shows the curve for the SSL reference configuration ($d_B = 4 \text{ nm}$, $d_W = 7 \text{ nm}$), the curves when we add or subtract a number of monolayers (0.3 nm wide each) to d_W , and Ohm's law at the contact, $J_{0\rightarrow 1}(V)$. $J_{i\rightarrow i+1}(V)$ exhibits a single maximum at the shown voltage range. Widening the well decreases the maximum and shifts it toward lower voltages. The opposite occurs when we have narrower wells. The intersection of $J_{i\rightarrow i+1}(V)$ and $J_{0\rightarrow 1}(V)$ (marked with a rhombus for the reference configuration) changes accordingly. This intersection roughly marks the voltage and current at which the contact issues a dipole wave, which



is the mechanism behind self-sustained oscillations of the current, excitability and other phenomena [5,44,54–56].

Figure 3. Tunneling current–voltage characteristics for the ideal SSL with $n_i = N_D$, $V_i = V$ comparing the reference configuration (ref.) $d_B = 4$ nm, $d_W = 7$ nm to the contact Ohm's law (dot-dashed straight line) and to other configurations with more or less monolayers (m.l.) at the wells. The rhombus marks the critical current J_{cr} and voltage V_{cr} at which the contact Ohm's law intersects the reference configuration. Reprinted from [21].

If we have a long ideal SSL at the reference configuration, the stationary voltage profile for a fixed current lower than J_{ref} , will be a solution $V^{(1)}(J)$ of $J_{i \to i+1}(V) = J$ on the first branch of $J_{i \to i+1}(V)$, except for a short region near the emitter where V_0 decreases from $V_0 = J/J_{0\to1}$ to $V^{(1)}$. Dynamics of one charge dipole wave occurs as follows. When the wave is far from the contacts, the field profile is roughly constant outside the wave except near the emitter. As the wave arrives at the collector, the current increases with time so as to keep the voltage at its constant value. If J(t) surpasses J_{ref} , the stationary state is no longer stable and a dipole wave is injected at the emitter contact. Repetition of this phenomenon produces the self-oscillations of the current [5,44,54–56]. Now, suppose we insert a different well far from the contacts in the reference configuration. The intersection of $J_{i\to i+1}(V)$ and $J_{0\to 1}(V)$ occurs at lower (resp. higher) current for a wider (resp. narrower) well than the reference one. Then we may expect that inserting a wider well may facilitate triggering a dipole wave in it when the current surpasses the corresponding intersecting value. The opposite is true if the inserted well is narrower. Thus, we expect richer SSL dynamics inserting wider wells.

We test our expectations by numerically simulating the deterministic model equations. With respect to the I - V curve of the ideal SSL in Figure 1, each added monolayer shifts significantly the region of self-oscillations until there are six extra monolayers in total. From that point on, adding more monolayers to the modified well does not change the self-oscillation region of the I - V curve. As in the case of unmodified SSLs, current self-oscillations are due to the dynamics of charge dipole waves. These waves are changed slightly when traveling through the wider well, which affects the evolution of the total current density by producing sudden and short-lived spikes.

We consider a SSL with a single modified well having 10 extra monolayers (i.e., $d_W = 10 \text{ nm}$). Its energy levels given by solving Equation (4) are $\mathcal{E}_{C_1} = 24.0 \text{ meV}$, $\mathcal{E}_{C_2} = 96.1 \text{ meV}$, $\mathcal{E}_{C_3} = 214.7 \text{ meV}$. The features of the I - V curve depend on the location of the modified well and the general *low voltage* behavior is the following. For voltages just above the onset of oscillations, dipole waves are repeatedly nucleated at the injector and disappear after a short trip. If a dipole wave born at the emitter can reach the wider well, no other wave will come out the emitter. Instead, self-sustained nucleations of dipole waves occur at the wider well for a large enough voltage bias V_{dc} . This fact plus the minimum number of SSL periods required for oscillations mean that the I - V curve takes on different shapes depending on whether the wider well i_w is near the injector, as in Figure 4a, near the collector, as in Figure 4d or away from both contacts, as in Figure 4b,c.



Figure 4. First plateau of the current–voltage characteristics for the SSL with 50 identical periods when the modified 10 nm-wide well is at: (a) $i_w = 5$, (b) $i_w = 20$, (c) $i_w = 30$, and (d) $i_w = 39$. Current traces and density plots of the electric field for: (e) $i_w = 20$, $V_{dc} = 0.23$ V; (f) $i_w = 20$, $V_{dc} = 0.5$ V; (g) $i_w = 30$, $V_{dc} = 0.5$ V; (h) $i_w = 39$, $V_{dc} = 1.02$ V. In the density plots, light and dark tones correspond to low and high field values, respectively.

To exhibit self-oscillations, SSLs need to surpass a critical length [86] and their doping density should be smaller than a critical value [86,87]. In the parameter range explored in our numerical simulations, the minimum length for a traveling dipole wave to induce self-oscillations is 14 periods. For $i_w < 14$, self-oscillations occur for a large voltage interval and are due to recycling at i_w , cf. Figure 1a. For $i_w > 14$ and as the DC voltage increases, the shape of the I - V curve is as follows:

- (i) There is a narrow voltage interval where charge waves nucleate at the emitter and die before reaching the modified well, cf. Figure 4b,e.
- (ii) For larger V_{dc} , a dipole wave nucleated at the injector reaches i_w and dies there. A stationary state forms for which excess charge is mostly located at i_w . This stationary state is accompanied by a large drop in the total current density, as shown in Figure 4a,d. The current drop occurs because most charge accumulates at the emitter contact (high current state) for lower *DC* voltage but it accumulates at the modified QW (low current state) for larger *DC* voltage.
- (iii) If i_w is between i = 14 and N 14, current self-oscillations occur again at another voltage interval, as illustrated by Figure 4b,c. This interval starts and ends in a

supercritical Hopf bifurcation, and it becomes smaller as $i_w \rightarrow N - 14$ and dipole waves nucleate at i_w . For larger voltages, the current is stationary and it rises smoothly to previous levels. As i_w approaches N - 14, self-oscillations occur for a third voltage range, depicted in Figure 4c. In this narrow higher voltage interval, oscillations start as a supercritical Hopf bifurcation but end at a SNIPER bifurcation. In this high voltage range, dipole waves nucleate at the injector and travel towards i_w whereas the electric field profile is large and quasi-stationary between i_w and the collector; see Figure 4f,g. After the SNIPER, the current becomes stationary and rises smoothly to second plateau levels.

(iv) For i_w between N - 14 and N, the intermediate voltage range of self-oscillations disappears and only narrow voltage ranges corresponding to recycling of small waves traveling near the injector or the collector survive, cf. Figure 4d,h.

5.2. Two Wider Wells

Let us place two identical and wider wells at i_1 and i_2 ($i_1 < i_2$). If the wider wells are different, the resulting dynamics will be similar to that explained previously for one well because one of the modified wells will dominate. Let the widths of the wider wells be d_{W_j} , j = 1, 2, and let regions I, II and III be the intervals $i < i_1, i_1 < i < i_2$, and $i > i_2$, respectively. As before, these wells have to include at least six extra monolayers for, otherwise, SSLs with less monolayers have drastically different I - V curves. We shall fix $i_1 = 5$, so that dipole nucleation occurs at i_1 and not at the injector, as mentioned in relation to Figure 4a. We then vary i_2 . If $d_{W_1} > d_{W_2}$, charge dipoles nucleate at i_1 and travel through i_2 with a small disturbance. The situation is qualitatively similar to Figure 4a with $i_w = i_1 = 5$. If $d_{W_1} < d_{W_2}$, the situation is similar to that of a single wider well at $i_w = i_2$ with an injector at i_1 . On the other hand, if $d_{W_1} \approx d_{W_2}$, SSL dynamics is more complex and interesting.

From now on, we consider $d_{W_1} = d_{W_2} = 10$ nm. Figure 5 illustrates typical I - V characteristic curves. If regions II and III have more than 14 wells, dipole waves can be nucleated at i_1 and at i_2 , they travel through regions II and III respectively, and their motion is strongly correlated. In general, each region II and III can support only one dipole wave. Some specific cases in which two waves may move on the same region will be discussed later. Correlation between dipole waves is as follows.

- (i) If a dipole wave does not reach the end of the region where it travels before it disappears, its annihilation will trigger nucleation at i_1 and at i_2 .
- (ii) Waves reaching i_2 (the end of region II) trigger nucleation at regions II and III.
- (iii) Waves reaching the end of region III will not necessarily trigger nucleation. These waves can stop near the collector and stay there for either short or long times (and then recycle). This situation can be seen as a metastable state.



Figure 5. First plateau of the current–voltage characteristics for the SSL with 50 identical periods with modified 10 nm-wide wells at $i_1 = 5$ and: (**a**) $i_2 = 25$, (**b**) $i_2 = 30$. The presence of two modified wells gives rise to two peaks in the low voltage, stationary, part of the I - V characteristic curve. In case (**a**), self-oscillations are time periodic. In case (**b**), self-oscillations are time periodic for $V_{dc} < 1$ V and for $V_{dc} > 1.5$ V, and they are complex (mostly chaotic) for $1 < V_{dc} < 1.5$ V.

Self-oscillations are time periodic in case (ii) but they may become chaotic in cases (i) and (iii), which explains the irregular disposition of the maxima in Figure 5. For $i_1 = 5$, observation of chaotic attractors requires the second well to satisfy $28 < i_2 \le 35$. Note that

modified SSLs exhibit self-oscillations with faster frequencies than in ideal SSLs because the dipole waves causing them travel on shorter regions of the device.

6. Hyperchaos and Intermittency

In this section, we explore complex self-oscillations occurring in the SSL with modified wells of 10 nm width at $i_1 = 5$ and $i_2 = 30$, which has the I - V curve depicted in Figure 5b.

Figure 6 shows a variety of dynamical behaviors for the voltage range where selfoscillations occur in Figure 5b. Each panel in Figure 6 provides complementary information. The Poincaré maps in Figure 6a,b are constructed from the time traces of two well-separated periods, $V_{12}(t)$ and $V_{42}(t)$. Figure 6a,b depict the values of $V_{42}(t)$ and of $\dot{V}_{42}(t)$, respectively, at times t^* where $V_{12}(t)$ takes on its mean value in time and $\dot{V}_{12}(t^*) > 0$ (so as to avoid redundant symmetric points). Figure 6c shows the three largest Lyapunov exponents. Figure 6d depicts the density plot of the normalized Fourier spectrum for each voltage value, which exhibits the dominant frequencies at each *DC* voltage.



Figure 6. (a) Poincaré map from $V_{42}(t)$, (b) Poincaré map from $\dot{V}_{42}(t)$, (c) Lyapunov exponents, and (d) Fourier spectrum as functions of DC voltage for the modified SSL with $i_1 = 5$ and $i_2 = 30$. Each panel shows features hidden in the other ones. The Poincaré map reveals jumps between periodic attractors at $V_{dc} = 1.3$ V and $V_{dc} = 1.43$ V. The Fourier spectrum reveals the underlying behavior to be quasi-periodic with different incommensurate frequencies, whereas the Lyapunov exponents show that the system is hyperchaotic for $V_{dc} < 1.08$ V ($\lambda_1, \lambda_2 > 0$ and of comparable scales). For $V_{dc} > 1.08$ V, the system has intermittent chaos at different time-scales ($\lambda_1 \gg \lambda_2 \approx 0$). Reprinted from [21].

As V_{dc} increases, the different attractors can be visualized by trajectories in the phase plane (V_{15} , V_{35}) for the voltage drops in two widely separated barriers, cf Figure 7. Firstly, the stationary state loses its stability and a time periodic attractor appears at $V_{dc} = 0.8$ V. The voltage profiles consist of charge dipole waves being repeatedly nucleated at both modified wells and advancing towards the collector without reaching it, cf Figure 8.



Figure 7. Phase plane portraits (V_{15} , V_{35}) for $V_{dc} =$ (**a**) 1.01 V, (**b**) 1.03 V, (**c**) 1.10 V, (**d**) 1.20 V, (**e**) 1.275 V, (**f**) 1.30 V, (**g**) 1.40 V, (**h**) 1.45 V, (**i**) 1.50 V.



Figure 8. Current traces and density plots of the electric field profile for $V_{dc} = 0.9$ V. For this low voltage periodic attractor, the waves at regions II and III do not reach i_2 or the collector, respectively. In the density plots, light and dark tones correspond to low and high field values, respectively. Reprinted from [21].

At $V_{dc} = 0.96$ V a second cycle (periodic attractor) appears and interacts with the first one. The result is a hyperchaotic attractor with two positive Lyapunov exponents. Trajectories fill the space between the two cycles. In the voltage interval $0.961 < V_{dc} < 1.1$ for hyperchaos (only one Lyapunov exponent is positive for $0.96 < V_{dc} < 0.961$), dipole waves nucleated at the second modified well either cannot reach the collector or, if they do, dipoles cannot stay in the wells near the collector. See Figure 9a. For larger voltages, the second Lyapunov exponent becomes smaller albeit positive, and intermittent chaos appears instead, cf. Figure 6c. This corresponds to the appearance of another cycle that interacts with

the others and eventually disappears at a saddle point, as shown in Figure 7 for $V_{dc} = 1.03$ V and 1.10 V. Intermittency chaos appears for the interval $1.10 < V_{dc} < 1.37$: irregular bursts corresponding to a cycle are separated by intervals for which the trajectories are close to the saddle point, cf Figure 7. This behavior is associated to dipole waves that reach the collector, stop there and remain in the last SSL periods (quiescent stage), whereas periodic bursts are associated to dipole wave recycling in Regions II and III. At $V_{dc} = 1.2$ V, the saddle point expands to a saddle cycle and the intermittent behavior continues. The difference is that the quiescent stage is associated to low frequency oscillations. See Figure 9b.





At $V_{dc} = 1.37$ V, the intermittency becomes a period 3 cycle (three loop trajectories in the phase plane). At larger *DC* voltages the periodic behavior continues and it becomes simpler (two loops at 1.43 V, a single loop for larger voltages). The transition from periodic attractors with three loops to two loop ones at 1.43 V is rather abrupt, as shown in Figure 6a,b. We have checked that there is a hysteresis cycle about this voltage value that becomes manifest by sweeping up or down the *DC* voltage. The last branch of time periodic oscillations disappears at a supercritical Hopf bifurcation.

7. Effect of Width Randomness and Noise

7.1. Width Randomness

When growing SSLs, it is difficult to control perfectly the width of the layers of the two semiconductors. In this section, we report the effects of fluctuations in well width on SSL current self-oscillations. We consider that the largest effects come from errors in the number of monolayers during epitaxial growth of the SSL. Thus, we ignore smaller effects such as fluctuations in barrier width and composition, internal and external noise and fluctuations in doping density. We set $d_{W_i} + \delta_i$ to be well widths, where $d_{W_5} = d_{W_{30}} = 10$ nm, and

 $d_{W_i} = 7$ nm for the other wells, $i \neq 5,30$. We extract δ_i out of a zero mean normal distribution with standard deviation σ . Then deviations larger than $\pm 2\sigma$ are rare. For example, if $\sigma = 0.5$ nm, widths that deviate more than 1 nm from d_{W_i} are rare.

Given a random configuration of δ_i with standard deviation σ , we have numerically solved the SSL model. Depending on the obtained configuration, we have observed that intervals of hyperchaos or intermittent chaos are destroyed or still remain for that disordered configuration. When there are long voltage intervals (having widths comparable to those in the SSL without disorder, e.g., almost 1 V wide, as seen in Figure 5b) where the chaotic behavior of the SSL without disorder is kept undisturbed, we consider these examples as successes. If disorder causes new periodicity or stationary windows to appear within long voltage intervals of formerly chaotic behavior of the SSL without disorder, we consider these examples as failures. For a given value of σ , the success rate of disordered SSLs that still exhibit chaotic behavior is shown in Figure 10. For $\sigma < 0.015$ nm, chaotic attractors observed for the SSL without disorder remain. However, $\sigma = 0.024$ nm is sufficient to have a lower success rate of 70%.



Figure 10. Success rate measuring fraction of simulations where chaotic attractor remains for a given value of the standard deviation σ . Reprinted from [21].

A different observation is the following. Let $(x_1, ..., x_N)$ be a sequence of numbers obtained from a normal distribution with zero mean and unit variance. Then $\delta_i = \sigma x_i$ correspond to a configuration extracted from a normal distribution with zero mean and σ^2 variance. By increasing σ , we find a threshold $\sigma_{cr}(x_1, ..., x_N)$, above which the attractors of the SSL without disorder undergo significant changes (e.g., inhibition or disappearance of current oscillations). This is related to the change of current–voltage characteristics with well width displayed in Figure 4. If the difference between widths of adjacent wells, $\delta_i - \delta_{i+1} > 0$, is large, dipole waves experience difficulty crossing these wells. In turn, this explains why disorder inhibits oscillations and chaos.

When building SSL devices, disorder effects are very important and have to be controlled as much as possible. During epitaxial growth [4], Al atoms within each interface alloy monolayer may be segregated into local clusters or not be positioned randomly in the Ga or the As sublattice [90]. This yields a nonzero σ even if there are no errors in the number of monolayers per barrier and well (recall that the monolayer width is 0.3 nm). Careful design achieves $\sigma < 0.018$ nm in simpler devices [90,91], which would yield reliably chaotic SSLs according to the success rate of Figure 10.

7.2. Noise

Here we consider the effects of internal noise (shot and thermal noise), as in Equations (21) and (23), and the effect of external voltage noise (2 mV rms for a 50 Ohm resistor), as in Equation (22), on the Lyapunov exponents of chaotic attractors. Figure 11 shows our results. For hyperchaos, noise produces a dispersion near the deterministic values of the Lyapunov exponents, with larger standard deviation for the second largest exponent, cf Figure 11a. For intermittent chaos, the two largest Lyapunov exponents are noticeably smaller than their values in the absence of noise cf Figure 11b. Thus, by repeated

simulations, we have concluded that the effect of noise is to decrease the largest Lyapunov exponent of the chaotic attractors and to increase slightly the third Lyapunov exponent. The latter does not become positive. Noise forces the system to visit more often contraction regions of the phase space such as the quiescent regions between bursts in intermittent chaos. This lowers the largest Lyapunov exponent [92]. Thus, contrary to the effect reported and observed in ideal SSL with identical periods [38,57], noise does not enhance chaos in these modified SSL, but its effect is quite small.



Figure 11. Effect of shot and thermal noise on the three largest Lyapunov exponents (noiseless values marked by tilted triangles) for (**a**) $V_{dc} = 0.98$ V (hyperchaos) and (**b**) $V_{dc} = 1.15$ V (intermittent chaos). The boxes describe the distribution of exponents and the vertical bars indicate the standard deviation of fluctuations.

8. Conclusions

In this paper, we have presented a general theory of nonlinear vertical transport in weakly coupled SSLs based on the large separation of time scales [72]: the relaxation times within subbands are much shorter than intersubband scattering times which, in turn, are much shorter than dielectric relaxation times. From this hierarchy of times, we derive spatially discrete equations for voltage drops at barriers and wells and subband populations. When intersubband scattering times are much shorter than dielectric relaxation of electrons, we obtain the sequential resonant tunneling model of Ref. [67] which can be further simplified to equations for the average electric fields and electron densities at QWs [54,73]. Other theories yield different expressions for the tunneling current [55] but they still assume the same hierarchy of time scales.

The I - V current–voltage characteristics of the SSL provides an equivalent bifurcation diagram of stable solutions of its governing equations. It is extremely sensitive to the chosen configuration and to the fluctuations in well widths due to epitaxial growth of the SSL [4]. Our sequential resonant tunneling equations have been modified to take into account these fluctuations as well as internal and external noises. We start considering an ideal SSL of identical periods without noise effects. Typically, it has stationary states (whose field profile consists of a low and a high field domain joined by some intermediate fields which constitute a frozen wavefront) and time periodic states due to the motion of high field domains that are traveling charge dipoles. These dipole waves are repeatedly triggered at the emitter contact and move toward the collector contact of the SSL [5,54,56]. To produce a richer dynamics, we have inserted one wider QW in the SSL because this allows for triggering additional dipole waves at the modified well depending on its location and applied DC voltage bias. Indeed, we have found richer I - V characteristics and larger voltage intervals of time-periodic solutions, but we have not found chaotic solutions. Inserting two wider wells of different widths will result in dynamics similar to the one wider well case because the wider of the two wells dominates dynamics. Inserting two identical wider wells produces a more robust and resilient chaos on wider bias ranges: hyperchaos with two positive Lyapunov exponents and intermittent chaos with a single positive exponent [21].

Chaotic states of deterministic dynamics for two identically modified wells persist if we add realistic internal and external noises and are robust to sufficiently small disorder fluctuations. If the difference between widths of adjacent wells due to disorder is large, dipole waves experience difficulty crossing these wells. This impediment for dipole waves to move across the SSL explains why disorder inhibits oscillations and chaos. Thus, there is a competition between chaotic dynamics of the deterministic equations requiring dipole waves in two identically modified wells and disorder due to epitaxial growth that can localize charge dipoles at wells and forestall current oscillations. State-of-the-art epitaxial growth techniques are known to produce devices with no errors in the number of monolayers per barrier and well and standard deviations smaller than 0.018 nm. According to Figure 10, such successful growth would produce reliably chaotic SSLs with a success rate over 70%. It is plausible that inserting more identical wider wells on longer SSLs may increase the complexity of the resulting dynamics but there will be compromise between the total number of admissible SSL periods that is possible to grow with sufficiently small standard deviation and the errors introduced during epitaxial growth. The complex dynamics described in this paper could be observed in experiments with epitaxially grown SSLs. Another application is using synchronization of chaotic devices for secure communications [93]. Since synchronization of chaotic SSLs has been demonstrated in experiments [94,95], it is possible to use our work to build devices that distribute encryption keys safely by exploiting chaos synchronization [96].

Author Contributions: Conceptualization, L.L.B., M.C. and E.M.; methodology, L.L.B., M.C. and E.M.; software, M.C. and E.M.; validation, L.L.B., M.C. and E.M.; formal analysis, L.L.B., M.C. and E.M.; investigation, L.L.B., M.C. and E.M.; resources, L.L.B., M.C. and E.M.; data curation, L.L.B., M.C. and E.M.; writing—original draft preparation, L.L.B.; writing—review and editing, L.L.B.; visualization, E.M.; supervision, L.L.B.; project administration, L.L.B. and M.C.; funding acquisition, L.L.B. and M.C. All authors have read and agreed to the published version of the manuscript.

Funding: This work was funded by the FEDER/Ministerio de Ciencia, Innovación y Universidades— Agencia Estatal de Investigación grant PID2020-112796RB-C22, by the Madrid Government (Comunidad de Madrid-Spain) under the Multiannual Agreement with UC3M in the line of Excellence of University Professors (EPUC3M23), and in the context of the V PRICIT (Regional Programme of Research and Technological Innovation).

Institutional Review Board Statement: Not applicable.

Informed Consent Statement: Not applicable.

Data Availability Statement: Not applicable.

Conflicts of Interest: The authors declare no conflict of interest.

Abbreviations

The following abbreviations are used in this manuscript:

- SSL Semiconductor superlattice
- QW Quantum well
- QB Quantum barrier

SNIPER Saddle-node infinite period

Appendix A. Derivation of Deterministic Tunneling Currents

Following Ref. [97], the tunneling Hamiltonian is

$$H_{\text{total}} = H + H_T = \sum_{i=0}^{N+1} H_i + \sum_{j=0}^{N} H_{T_j},$$
(A1)

$$H_{i} = \sum_{\mathbf{k}_{i}} E_{i\mathbf{k}_{i}} c_{i\mathbf{k}_{i}}^{\dagger} c_{i\mathbf{k}_{i}}, \quad H_{T_{j}} = \sum_{\mathbf{k}_{j}, \mathbf{k}_{j+1}} \left(T_{\mathbf{k}_{j}, \mathbf{k}_{j+1}} c_{j+1}^{\dagger} c_{j\mathbf{k}_{j}} + H.c. \right).$$
(A2)

Here the Hamiltonian *H* is a sum of individual Hamiltonians for each QW or contact and assumes that they are uncoupled from one another. H.c. stands for the Hermitian conjugate of the preceding term. The unperturbed single-electron states have absolute energies denoted by $E_{i\mathbf{k}_i}$ measured from the conduction band edge in the emitter contact. We have $E_{j\mathbf{k}_i} = \epsilon + E_{\perp}, E_{\perp} = \hbar^2 \mathbf{k}_{\perp}^2 / (2m_W)$, in which ϵ is the energy at the well, and \mathbf{k}_{\perp} comprises the components of the wave vector that are orthogonal to the SL growth direction. The operators $c_{i\mathbf{k}_i}^{\dagger}$ and $c_{i\mathbf{k}_i}$ denote creation and annihilation operators for electrons in the *i*th well or contact with three-dimensional wave vector \mathbf{k}_i and satisfy standard fermionic commutation rules: $\{c_{i\mathbf{k}_{i}}, c_{j\mathbf{k}_{j}}\} = c_{i\mathbf{k}_{i}}c_{j\mathbf{k}_{j}} + c_{j\mathbf{k}_{j}}, c_{i\mathbf{k}_{i}} = 0, \{c_{i\mathbf{k}_{i}}^{\dagger}, c_{j\mathbf{k}_{i}}^{\dagger}\} = 0, \{c_{i\mathbf{k}_{i}}, c_{j\mathbf{k}_{i}}^{\dagger}\} = \delta_{ij}\delta_{\mathbf{k}_{i}\mathbf{k}_{j}}.$ Each QW contains a set of n subbands whose Fermi energy measured from the conduction band edge in the emitter contact are $\epsilon_{w_{i}^{(\nu)}}$, $\nu = 1, ..., n$. H_T is a small perturbation of H representing the tunneling coupling between adjacent wells. Typically, an electron tunnels from the first subband of a QW into subband ν of the next QW and the electron population in the subbands is in local equilibrium because the relaxation times within subbands are much shorter than intersubband scattering times which, in turn, are much shorter than dielectric relaxation times. This hierarchy of times [72] is the basis for all theories of spatially discrete models of SSLs [5,54–56].

The change of the electron operator number at the *i*th well, $N_i = \sum_{\mathbf{k}_i} c_{i\mathbf{k}_i}^{\dagger} c_{i\mathbf{k}_i}$, is related to the tunneling current operator $\hat{J}_{i \to i+1}$ by

$$e\dot{N}_{i} = \frac{i}{\hbar}[H_{\text{total}}, eN_{i}] = \frac{i}{\hbar}[H_{T_{i-1}}, eN_{i}] - \frac{i}{\hbar}[H_{T_{i}}, eN_{i}] = \hat{J}_{i-1\to i} - \hat{J}_{i\to i+1}.$$
 (A3)

In the interaction representation, we have $H_T(t) = e^{iHt/\hbar}H_Te^{-iHt/\hbar}$ and $\hat{J}_{i\to i+1}(t) = e^{iHt/\hbar}\hat{J}_{i\to i+1}e^{-iHt/\hbar}$ and the average tunneling current density from subband 1 of QW *i* to subband ν of QW *i* + 1 satisfies the Kubo formula [98–100]

$$J_{1,i\to\nu,i+1}(t) = \frac{1}{\hbar} \int_{-\infty}^{t} \langle [\hat{J}_{1,i\to\nu,i+1}(t), H_T(t')] \rangle \, dt'.$$
(A4)

Here the average is over the thermodynamic local equilibria at the subbands of QWs i and i + 1. A straightforward lengthy evaluation yields

$$J_{1,i \to \nu,i+1}(t) = \frac{4\pi e}{\hbar} \sum_{\mathbf{k}_{j} \mathbf{k}_{j+1}} |T_{\mathbf{k}_{j} \mathbf{k}_{j+1}}|^{2} \delta(E_{j+1 \mathbf{k}_{j+1}} - E_{j \mathbf{k}_{j}}) \\ \times [n_{F}(E_{j+1 \mathbf{k}_{j+1}} - \epsilon_{w_{j+1}}) - n_{F}(E_{j \mathbf{k}_{j}} - \epsilon_{w_{j}})],$$
(A5)

where $n_F(x) = 1/(1 + e^{x/k_BT})$ is the Fermi distribution function. The matrix element:

$$T_{\mathbf{k}_{j}\mathbf{k}_{j+1}} = \frac{\hbar^2}{2m_B} \int_A (\psi_j \nabla \psi_{j+1}^* - \psi_{j+1}^* \nabla \psi_j) \cdot d\mathbf{A},\tag{A6}$$

is calculated by using Bardeen's Transfer Hamiltonian method [79,80]. The wave functions of two adjacent square QWs, ψ_j and ψ_{j+1} , are approximated by those of free particles in two isolated wells separated by an infinitely thick barrier. Then continuity of wave functions and their derivatives are used to find out the coefficients of the wave function expressions in different space intervals and the resulting wave functions produce the matrix element (A6) [80]. The result is [97]

$$|T_{\mathbf{k}_{i}\mathbf{k}_{i+1}}|^{2} = \frac{\pi\hbar^{4}}{2m_{B}^{2}}B_{i-1,i}B_{i,i+1}T_{i}\delta_{\mathbf{k}_{\perp}\mathbf{k}_{\perp}'},\tag{A7}$$

where the coefficients $B_{i-1,i}$ and the transmission coefficient are given by Equations (7) and (8), respectively. We now transform the sums in (A5) to integrals over the energies

 $E_{j\mathbf{k}_j} = \epsilon + E_{\perp}$ using a broadened spectral density to account for scattering. If the latter depends only on ϵ , we obtain

$$J_{1,i \to \nu,i+1} = \frac{e\hbar}{2m_B} \int d\epsilon \, A^i_{C_1}(\epsilon) A^{i+1}_{C_\nu}(\epsilon) B_{i-1,i}(\epsilon) B_{i,i+1}(\epsilon) T_i(\epsilon) \times \int dE_{\perp} \left[\frac{1}{1 + e^{(\epsilon + E_{\perp} - \epsilon_{w_i})}/k_B T} + \frac{1}{1 + e^{(\epsilon + E_{\perp} - \epsilon_{w_{i+1}})/k_B T}} \right]$$
(A8)

After changing variables so that the energy is measured from the bottom of the QW *i* [54], we perform the integral over E_{\perp} , and get Equation (6) as a result.

References

- Esaki, L.; Tsu, R. Superlattice and Negative Differential Conductivity in Semiconductors. *IBM J. Res. Dev.* 1970, 14, 61–65. [CrossRef]
- 2. Esaki, L.; Chang, L.L. New Transport Phenomenon in a Semiconductor "Superlattice". *Phys. Rev. Lett.* **1974**, 33, 495–498. [CrossRef]
- 3. Allan, G.; Bastard, G.; Boccara, N.; Lannoo, M.; Voos, M. (Eds.) *Heterojunctions and Semiconductor Superlattices*; Springer: Berlin/Heidelberg, Germany, 1986.
- 4. Grahn, H.T. (Ed.) Semiconductor Superlattices. Growth and Electronic Properties; World Scientific: Singapore, 1995.
- 5. Bonilla, L.L.; Grahn, H.T. Non-linear dynamics of semiconductor superlattices. Rep. Prog. Phys. 2005, 68, 577–683. [CrossRef]
- Schomburg, E.; Hofbeck, K.; Grenzer, J.; Blomeier, T.; Ignatov, A.A.; Renk, K.F.; Pavel'Ev, D.G.; Koschurinov, Y.; Ustinov, V.; Zhukov, A.; et al. Millimeter wave oscillator based on a quasiplanar superlattice electronic device. *Appl. Phys. Lett.* 1997, 71, 401–403. [CrossRef]
- 7. Minot, C.; Sahri, N.; Le Person, H.; Palmier, J.; Harmand, J.; Medus, J.; Esnault, J. Millimetre-wave negative differential conductance in GaInAs/AlInAs semiconductor superlattices. *Superlattices Microstruct.* **1998**, *23*, 1323–1332. [CrossRef]
- Palmier, J.; Minot, C.; Harmand, J.; Sibille, A.; Tanguy, D.; Penard, E. Recent results on superlattice transport and optoelectronics applications. *Superlattices Microstruct.* 1999, 25, 13–19. [CrossRef]
- 9. Xu, H.; Teitsworth, S.W. On the possibility of a shunt-stabilized superlattice terahertz emitter. *Appl. Phys. Lett.* **2010**, *96*, 022101. [CrossRef]
- Winnerl, S.; Seiwerth, W.; Schomburg, E.; Grenzer, J.; Renk, K.F.; Langerak, C.J.G.M.; van der Meer, A.F.G.; Pavel'Ev, D.G.; Koschurinov, Y.; Ignatov, A.A.; et al. Ultrafast detection and autocorrelation of picosecond THz radiation pulses with a GaAs/AlAs superlattice. *Appl. Phys. Lett.* 1998, 73, 2983–2985. [CrossRef]
- Winnerl, S.; Schomburg, E.; Brancl, S.; Kus, O.; Renk, K.F.; Wanke, M.C.; Allen, S.J.; Ignatov, A.A.; Ustinov, V.; Zhukov, A.; et al. Frequency doubling and tripling of terahertz radiation in a GaAs/AlAs superlattice due to frequency modulation of Bloch oscillations. *Appl. Phys. Lett.* 2000, 77, 1259–1261. [CrossRef]
- 12. Klappenberger, F.; Ignatov, A.A.; Winnerl, S.; Schomburg, E.; Wegscheider, W.; Renk, K.F. Broadband semiconductor superlattice detector for THz radiation. *Appl. Phys. Lett.* **2001**, *78*, 1673–1675. [CrossRef]
- Shao, Z.Z.; Yin, Z.Z.; Song, H.L.; Liu, W.; Li, X.J.; Zhu, J.; Biermann, K.; Bonilla, L.L.; Grahn, H.T.; Zhang, Y.H. Fast Detection of a Weak Signal by a Stochastic Resonance Induced by a Coherence Resonance in an Excitable GaAs/Al_{0.45}Ga_{0.55}As Superlattice. *Phys. Rev. Lett.* 2018, 121, 086806. [CrossRef]
- 14. Faist, J.; Capasso, F.; Sivco, D.L.; Sirtori, C.; Hutchinson, A.L.; Cho, A.Y. Quantum cascade laser. *Science* **1994**, *264*, 553–556. [CrossRef]
- 15. Wacker, A. Gain in quantum cascade lasers and superlattices: A quantum transport theory. *Phys. Rev. B* 2002, *66*, 085326. [CrossRef]
- 16. Malis, O.; Gmachl, C.; Sivco, D.L.; Pfeiffer, L.N.; Sergent, A.M.; West, K.W. The quantum cascade laser: A versatile high-power semiconductor laser for mid-infrared applications. *Bell Labs Tech. J.* **2005**, *10*, 199–214. [CrossRef]
- 17. Terazzi, R.; Gresch, T.; Giovannini, M.; Hoyler, N.; Sekine, N.; Faist, J. Bloch gain in quantum cascade lasers. *Nat. Phys.* 2007, *3*, 329–333. [CrossRef]
- 18. Vitiello, M.S.; Scalari, G.; Williams, B.; De Natale, P. Quantum cascade lasers: 20 years of challenges. *Opt. Express* 2015, 23, 5167–5182. [CrossRef]
- 19. Belkin, M.A.; Capasso, F. New frontiers in quantum cascade lasers: High performance room temperature terahertz sources. *Phys. Scr.* **2015**, *90*, 118002. [CrossRef]
- Li, W.; Reidler, I.; Aviad, Y.; Huang, Y.; Song, H.; Zhang, Y.; Rosenbluh, M.; Kanter, I. Fast Physical Random-Number Generation Based on Room-Temperature Chaotic Oscillations in Weakly Coupled Superlattices. *Phys. Rev. Lett.* 2013, 111, 044102. [CrossRef]
- Mompó, E.; Carretero, M.; Bonilla, L.L. Designing Hyperchaos and Intermittency in Semiconductor Superlattices. *Phys. Rev. Lett.* 2021, 127, 096601. [CrossRef]
- 22. Stinson, D.R. *Cryptography: Theory and Practice*; The CRC Press Series on Discrete Mathematics and Its Applications; CRC Press: Boca Raton, FL, USA, 1995.

- 23. Gallager, R.G. Principles of Digital Communication; Cambridge University Press: Cambridge, UK, 2008.
- 24. Nielsen, M.A.; Chuang, I.L. Quantum Computation and Quantum Information; Cambridge University Press: Cambridge, UK, 2000.
- 25. Asmussen, S.; Glynn, P.W. Stochastic Simulation: Algorithms and Analysis; Springer: Berlin/Heidelberg, Germany, 2007.
- Binder, K.; Heermann, D.W. Monte Carlo Simulation in Statistical Physics. An Introduction, 4th ed.; Springer: Berlin/Heidelberg, Germany, 2002.
- 27. Blanter, Y.; Büttiker, M. Shot noise in mesoscopic conductors. *Phys. Rep.* 2000, 336, 1–166. [CrossRef]
- Reydellet, L.-H.; Roche, P.; Glattli, D.C.; Etienne, B.; Jin, Y. Quantum Partition Noise of Photon-Created Electron-Hole Pairs. *Phys. Rev. Lett.* 2003, *90*, 176803. [CrossRef] [PubMed]
- 29. Février, P.; Gabelli, J. Tunneling time probed by quantum shot noise. Nat. Commun. 2018, 9, 4940. [CrossRef] [PubMed]
- 30. Uchida, A.; Amano, K.; Inoue, M.; Hirano, K.; Naito, S.; Someya, H.; Oowada, I.; Kurashige, T.; Shiki, M.; Yoshimori, S.; et al. Fast physical random bit generation with chaotic semiconductor lasers. *Nat. Photonics* **2008**, *2*, 728–732. [CrossRef]
- Reidler, I.; Aviad, Y.; Rosenbluh, M.; Kanter, I. Ultrahigh-Speed Random Number Generation Based on a Chaotic Semiconductor Laser. *Phys. Rev. Lett.* 2009, 103, 024102. [CrossRef] [PubMed]
- 32. Kanter, I.; Aviad, Y.; Reidler, I.; Cohen, E.; Rosenbluh, M. An optical ultrafast random bit generator. *Nat. Photonics* **2009**, *4*, 58–61. [CrossRef]
- 33. Sciamanna, M.; Shore, K.A. Physics and applications of laser diode chaos. Nat. Photonics 2015, 9, 151–162. [CrossRef]
- Tang, X.; Wu, Z.-M.; Wu, J.-G.; Deng, T.; Chen, J.-J.; Fan, L.; Zhong, Z.-Q.; Xia, G.-Q. Tbits/s physical random bit generation based on mutually coupled semiconductor laser chaotic entropy source. *Opt. Express* 2015, 23, 33130–33141. [CrossRef]
- Zhang, Y.; Kastrup, J.; Klann, R.; Ploog, K.H.; Grahn, H.T. Synchronization and Chaos Induced by Resonant Tunneling in GaAs/AlAs Superlattices. *Phys. Rev. Lett.* 1996, 77, 3001–3004. [CrossRef]
- 36. Grahn, H. Current self-oscillations and chaos in semiconductor superlattices. Superlattices Microstruct. 1999, 25, 7–11. [CrossRef]
- 37. Huang, Y.; Li, W.; Ma, W.; Qin, H.; Zhang, Y. Experimental observation of spontaneous chaotic current oscillations in GaAs/Al0.45Ga0.55As superlattices at room temperature. *Chin. Sci. Bull.* **2012**, *57*, 2070–2072. [CrossRef]
- Yin, Z.; Song, H.; Zhang, Y.; Ruiz-García, M.; Carretero, M.; Bonilla, L.L.; Biermann, K.; Grahn, H.T. Noise-enhanced chaos in a weakly coupled GaAs/(Al,Ga)As superlattice. *Phys. Rev. E* 2017, 95, 012218. [CrossRef]
- 39. Pikovsky, A.S.; Kurths, J. Coherence Resonance in a Noise-Driven Excitable System. Phys. Rev. Lett. 1997, 78, 775–778. [CrossRef]
- Giacomelli, G.; Giudici, M.; Balle, S.; Tredicce, J.R. Experimental Evidence of Coherence Resonance in an Optical System. *Phys. Rev. Lett.* 2000, *84*, 3298–3301. [CrossRef]
- Avila, J.F.M.; Cavalcante, H.L.D.D.S.; Leite, J.R.R. Experimental Deterministic Coherence Resonance. *Phys. Rev. Lett.* 2004, 93, 144101. [CrossRef]
- 42. DeVille, R.E.L.; Vanden-Eijnden, E.; Muratov, C.B. Two distinct mechanisms of coherence in randomly perturbed dynamical systems. *Phys. Rev. E* 2005, 72, 031105. [CrossRef]
- Hizanidis, J.; Balanov, A.; Amann, A.; Schöll, E. Noise-Induced Front Motion: Signature of a Global Bifurcation. *Phys. Rev. Lett.* 2006, 96, 244104. [CrossRef]
- 44. Mompo, E.; Ruiz-Garcia, M.; Carretero, M.; Grahn, H.T.; Zhang, Y.; Bonilla, L.L. Coherence Resonance and Stochastic Resonance in an Excitable Semiconductor Superlattice. *Phys. Rev. Lett.* **2018**, *121*, 086805. [CrossRef]
- 45. Fauve, S.; Heslot, F. Stochastic resonance in a bistable system. *Phys. Lett. A* **1983**, 97, 5–7. [CrossRef]
- McNamara, B.; Wiesenfeld, K.; Roy, R. Observation of Stochastic Resonance in a Ring Laser. *Phys. Rev. Lett.* 1988, 60, 2626–2629. [CrossRef]
- 47. Gammaitoni, L.; Hänggi, P.; Jung, P.; Marchesoni, F. Stochastic Resonance. Rev. Mod. Phys. 1998, 70, 223–287. [CrossRef]
- Hänggi, P. Stochastic Resonance in Biology How Noise Can Enhance Detection of Weak Signals and Help Improve Biological Information Processing. *ChemPhysChem* 2002, *3*, 285–290. [CrossRef] [PubMed]
- Badzey, R.L.; Mohanty, P. Coherent signal amplification in bistable nanomechanical oscillators by stochastic resonance. *Nature* 2005, 437, 995–998. [CrossRef] [PubMed]
- Burada, P.; Schmid, G.; Reguera, D.; Vainstein, M.; Rubi, J.M.; Hanggi, P. Entropic Stochastic Resonance. *Phys. Rev. Lett.* 2008, 101, 130602. [CrossRef] [PubMed]
- Schneider, H.; von Klitzing, K.; Ploog, K. Resonant and non-resonant tunneling in GaAsAlAs multi quantum well structures. Superlattices Microstruct. 1989, 5, 383–396. [CrossRef]
- 52. Grahn, H.T.; Schneider, H.; Rühle, W.W.; von Klitzing, K.; Ploog, K. Nonthermal occupation of higher subbands in semiconductor superlattices via sequential resonant tunneling. *Phys. Rev. Lett.* **1990**, *64*, 2426–2429. [CrossRef]
- Grahn, H.T.; Haug, R.J.; Müller, W.; Ploog, K. Electric-field domains in semiconductor superlattices: A novel system for tunneling between 2D systems. *Phys. Rev. Lett.* 1991, 67, 1618–1621. [CrossRef]
- Bonilla, L.L. Theory of Nonlinear Charge Transport, Wave Propagation and Self-oscillations in Semiconductor Superlattices. J. Phys. Cond. Matter 2002, 14, R341–R381. [CrossRef]
- 55. Wacker, A. Semiconductor superlattices: A model system for nonlinear transport. Phys. Rep. 2002, 357, 1–111. [CrossRef]
- 56. Bonilla, L.L.; Teitsworth, S.W. Nonlinear Wave Methods for Charge Transport; Wiley: Weinheim, Germany, 2010.
- 57. Alvaro, M.; Carretero, M.; Bonilla, L.L. Noise-enhanced spontaneous chaos in semiconductor superlattices at room temperature. *Eur. Lett.* **2014**, *107*, 37002. [CrossRef]
- 58. Bonilla, L.L.; Alvaro, M.; Carretero, M. Chaos-based true random number generators. J. Math. Ind. 2016, 7, 1–17. [CrossRef]

- Essen, J.; Ruiz-Garcia, M.; Jenkins, I.; Carretero, M.; Bonilla, L.L.; Birnir, B. Parameter dependence of high-frequency nonlinear oscillations and intrinsic chaos in short GaAs/(Al, Ga)As superlattices. Chaos: Interdiscip. J. Nonlinear Sci. 2018, 28, 043107. [CrossRef]
- 60. Amann, A.; Schlesner, J.; Wacker, A.; Schöll, E. Chaotic front dynamics in semiconductor superlattices. *Phys. Rev. B* 2002, 65, 193313. [CrossRef]
- Amann, A.; Peters, K.; Parlitz, U.; Wacker, A.; Schöll, E. A Hybrid Model for Chaotic Front Dynamics. *Phys. Rev. Lett.* 2003, 91, 066601. [CrossRef]
- 62. Ott, E. Chaos in Dynamical Systems; Cambridge University Press: Cambridge, UK, 1993.
- 63. Cencini, M.; Cecconi, F.; Vulpiani, A. Chaos. From Simple Models to Complex Systems; World Scientific: Hackensack, NJ, USA, 2010.
- 64. Yukalov, V.I.; Gluzman, S. Weighted fixed points in Self-similar analysis of time series. *Int. J. Mod. Phys. B* 1999, *13*, 1463–1476. [CrossRef]
- Goldman, V.J.; Tsui, D.C.; Cunningham, J.E. Observation of intrinsic bistability in resonant -tunneling structures. *Phys. Rev. Lett.* 1987, 58, 1256–1259. [CrossRef]
- Goldman, V.J.; Tsui, D.C.; Cunningham, J.E. Resonant tunneling in magnetic fields: Evidence for space-charge buildup. *Phys. Rev.* B 1987, 35, 9387–9390. [CrossRef]
- 67. Aguado, R.; Platero, G.; Moscoso, M.; Bonilla, L.L. Microscopic Model for Sequential Tunneling in Semiconductor Multiple Quantum Wells. *Phys. Rev. B* **1997**, *55*, R16053–R16056. [CrossRef]
- Likharev, K.; Bakhvalov, N.; Kazacha, G.; Serdyukova, S. Single-electron tunnel junction array: An electrostatic analog of the Josephson transmission line. *IEEE Trans. Magn.* 1989, 25, 1436–1439. [CrossRef]
- 69. Laikhtman, B. Current-voltage instabilities in superlattices. Phys. Rev. B 1991, 44,11260–11265. [CrossRef]
- 70. Laikhtman, B.; Miller, D. Theory of current-voltage instabilities in superlattices. Phys. Rev. B 1993, 48, 5395–5412. [CrossRef]
- 71. Prengel, F.; Wacker, A.; Schöll, E. Simple model for multistability and domain formation in semiconductor superlattices. *Phys. Rev. B* **1994**, *50*, 1705–1712. [CrossRef] [PubMed]
- 72. Bonilla, L.L.; Galán, J.; Cuesta, J.A.; Martínez, F.C.; Molera, J.M. Dynamics of electric field domains and oscillations of the photocurrent in a simple superlattice model. *Phys. Rev. B* **1994**, *50*, 8644–8657. [CrossRef] [PubMed]
- 73. Bonilla, L.L.; Platero, G.; Sánchez, D. Microscopic derivation of transport coefficients and boundary conditions in discrete drift-diffusion models of weakly coupled superlattices. *Phys. Rev. B* 2000, *62*, 2786–2796. [CrossRef]
- Wacker, A.; Jauho, A.-P. Microscopic modelling of perpendicular electronic transport in doped multiple quantum wells. *Phys. Scr.* 1997, *T69*, 321–324. [CrossRef]
- 75. Wacker, A.; Jauho, A.-P.; Rott, S.; Markus, A.; Binder, P.; Döhler, G.H. Inelastic Quantum Transport in Superlattices: Success and Failure of the Boltzmann Equation. *Phys. Rev. Lett.* **1999**, *83*, 836–839. [CrossRef]
- 76. Wacker, A. Vertical transport and domain formation in multiple quantum wells. In *Theory and Transport Properties of Semiconductor Nanostructures;* Schöll, E., Ed.; Chapter 10; Springer: Dordrecht, The Netherlands, 1998.
- 77. Bastard, G.Wave Mechanics Applied to Semiconductor Heterostructures; Halsted P.: New York, NY, USA, 1988.
- 78. Weisbuch, C.; Vinter, B. *Quantum Semiconductor Structures*; Academic Press: Boston, MA, USA, 1991.
- 79. Bardeen, J. Tunneling from a many-particle point of view. Phys. Rev. Lett. 1961, 6, 57–59. [CrossRef]
- 80. Payne, M.C. Transfer Hamiltonian description of resonant tunnelling. J. Phys. C Solid State Phys. 1986, 19, 1145–1155. [CrossRef]
- Brey, L.; Platero, G.; Tejedor, C. Generalized transfer Hamiltonian for the study of resonant tunneling. *Phys. Rev. B* 1988, 38, 10507–10511. [CrossRef]
- 82. Jonson, M. Quantum-mechanical resonant tunneling in the presence of a boson field. Phys. Rev. B 1989, 39, 5924–5933. [CrossRef]
- Platero, G.; Brey, L.; Tejedor, C. Coherent and sequential tunneling in double barriers with transverse magnetic fields. *Phys. Rev. B* 1989, 40, 8548–8551. [CrossRef]
- 84. Inarrea, J.; Platero, G. Photoinduced current bistabilities in a semiconductor double barrier. Eur. Lett. 1996, 33, 477–482. [CrossRef]
- 85. Platero, G.; Aguado, R. Photon-assisted transport in semiconductor nanostructures. Phys. Rep. 2004, 395, 1–157. [CrossRef]
- Wacker, A.; Moscoso, M.; Kindelan, M.; Bonilla, L.L. Current-voltage characteristic and stability in resonant-tunneling n-doped semiconductor superlattices. *Phys. Rev. B* 1997, 55, 2466–2475. [CrossRef]
- Carpio, A.; Bonilla, L.L.; Wacker, A.; Schöll, E. Wavefronts may move upstream in semiconductor superlattices. *Phys. Rev. E* 2000, 61, 4866–4876. [CrossRef]
- 88. Landau, L.D.; Lifshitz, E.M. Fluid Mechanics; Pergamon P.: New York, NY, USA, 1959.
- 89. Keizer, J. Statistical Thermodynamics of Nonequilibrium Processes; Springer: New York, NY, USA, 1987.
- 90. DasMahapatra, P.; Sexton, J.; Missous, M.; Shao, C.; Kelly, M.J. Thickness control of molecular beam epitaxy grown layers at the 0.01–0.1 monolayer level. *Semicond. Sci. Technol.* **2012**, *27*, 085007. [CrossRef]
- Missous, M.; Kelly, M.J.; Sexton, J. Extremely Uniform Tunnel Barriers for Low-Cost Device Manufacture. *IEEE Electron Device* Lett. 2015, 36, 543–545. [CrossRef]
- Zhou, C.; Kurths, J. Noise-Induced Phase Synchronization and Synchronization Transitions in Chaotic Oscillators. *Phys. Rev. Lett.* 2002, *88*, 230602. [CrossRef]
- Kinzel, W.; Englert, A.; Kanter, I. On chaos synchronization and secure communication. *Philos. Trans. R. Soc. Lond. Ser. A Math. Phys. Eng. Sci.* 2010, 368, 379–389. [CrossRef]

- 94. Li, W.; Aviad, Y.; Reidler, I.; Song, H.; Huang, Y.; Biermann, K.; Rosenbluh, M.; Zhang, Y.; Grahn, H.T.; Kanter, I. Chaos synchronization in networks of semiconductor superlattices. *Eur. Lett.* **2015**, *112*, 30007. [CrossRef]
- Liu, W.; Yin, Z.; Chen, X.; Peng, Z.; Song, H.; Liu, P.; Tong, X.; Zhang, Y. A secret key distribution technique based on semiconductor superlattice chaos devices. *Sci. Bull.* 2018, *63*, 1034–1036. [CrossRef]
- Keuninckx, L.; Soriano, M.C.; Fischer, I.; Mirasso, C.R.; Nguimdo, R.M.; Van der Sande, G. Encryption key distribution via chaos synchronization. *Sci. Rep.* 2017, 7, srep43428. [CrossRef] [PubMed]
- Xu, H.; Teitsworth, S.W. Dependence of electric field domain relocation dynamics on contact conductivity in semiconductor superlattices. *Phys. Rev. B* 2007, *76*, 235302. [CrossRef]
- 98. Kubo, R. Statistical-Mechanical Theory of Irreversible Processes. I. General Theory and Simple Applications to Magnetic and Conduction Problems. *J. Phys. Soc. Jpn.* **1957**, *12*, 570–586. [CrossRef]
- 99. Kubo, R.; Toda, M.; Hashitsume, N. Statistical Physics II: Nonequilibrium Statistical Mechanics, 2nd ed.; Springer: Berlin/Heidelberg, Germany, 1991.
- 100. Zwanzig, R. Nonequilibrium Statistical Mechanics; Oxford University Press: New York, NY, USA, 2001.