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Title: Hidden attractors in dynamical models of phase-locked loop circuits : limitations of simulation in MATLAB and SPICE

Year: 2017

Version:

Please cite the original version:

Kuznetsov, N., Leonov, G. A., Yuldashev, M. V., & Yuldashev, R. V. (2017). Hidden attractors in dynamical models of phase-locked loop circuits : limitations of simulation in MATLAB and SPICE. *Communications in Nonlinear Science and Numerical Simulation*, 51, 39-49. <https://doi.org/10.1016/j.cnsns.2017.03.010>

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Accepted Manuscript

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PII: S1007-5704(17)30090-4
DOI: [10.1016/j.cnsns.2017.03.010](https://doi.org/10.1016/j.cnsns.2017.03.010)
Reference: CNSNS 4137

To appear in: *Communications in Nonlinear Science and Numerical Simulation*

Received date: 30 August 2016
Revised date: 4 November 2016
Accepted date: 13 March 2017

Please cite this article as: Kuznetsov N. V., Leonov G. A., Yuldashev M. V., Yuldashev R. V., Hidden attractors in dynamical models of phase-locked loop circuits: limitations of simulation in MATLAB and SPICE, *Communications in Nonlinear Science and Numerical Simulation* (2017), doi: [10.1016/j.cnsns.2017.03.010](https://doi.org/10.1016/j.cnsns.2017.03.010)

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Hidden attractors in dynamical models of phase-locked loop circuits: limitations of simulation in MATLAB and SPICE.

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Abstract

During recent years it has been shown that hidden oscillations, whose basin of attraction does not overlap with small neighborhoods of equilibria, may significantly complicate simulation of dynamical models, lead to unreliable results and wrong conclusions, and cause serious damage in drilling systems, aircrafts control systems, electromechanical systems, and other applications. In this article a survey of various phase-locked loop based circuits (used in satellite navigation systems, optical, and digital communication), where such difficulties take place in MATLAB and SPICE, is provided. Considered examples can be used for testing other phase-locked loop based circuits and simulation tools, and motivate the development and application of rigorous analytical methods for the global analysis of phase-locked loop based circuits.

Keywords: Phase-locked loop, two-phase PLL, optical Costas loop, simulation, MATLAB, SPICE, synchronization, nonlinear control system, dynamical system, hidden attractor, multistability

1. Introduction

The phase-locked loop (PLL) based circuits are widely used nowadays in various applications such as telecommunications, computer architectures, navigation (e.g. in GPS, GLONASS) and many others. One of the main features of PLL-based circuits is synchronization of the controlled oscillator (slave oscillator) frequency to the frequency of reference signal (master oscillator). An important engineering characteristic of PLL-based circuit is a set of frequency deviations for which the PLL-based circuit achieves a synchronized (locked) state for any initial state [1, 2]: for a dynamical model of PLL-based circuit in the signal's phase space the pull-in range corresponds to such frequency deviations that any solution of dynamical model is attracted to one of the equilibria (rigorous definition can be found in [3–5]).

Since PLL is essentially nonlinear control system and its nonlinear analysis is a challenging task (see, e.g. [4, 6–12]), in practice, simulation is widely used for the study of PLL-based circuits (for a discussion of PLL-based circuits simulation in SPICE and MATLAB see, e.g. [13–15]). However, recently it was shown that simulation may not reveal complex behavior of PLL: such examples where the simulation of PLL-based circuits leads to unreliable results, are demonstrated in [16, 17]. These examples demonstrate the difficulties of numerical search of so-called hidden oscillations, whose basin of attraction does not overlap with the neighborhood of an equilibrium point, and thus may be difficult to find numerically [18–20]. In this case the observation of one or another stable solution may depend on the initial data and integration step.

This article provides a survey of various classical PLL-based circuits for which difficulties of simulation related to the hidden oscillations take place in MATLAB and SPICE. Considered examples can be used for testing other simulation software and models of PLL-based circuits. S. Goldman, who has worked at Texas Instruments over 20 years, notes [21, p.XIII] that *PLLs are used as pipe cleaners for breaking simulation tools*. Also the considered examples motivate to develop and apply rigorous analytical methods for the global analysis of PLL-based circuits [4].

2. Simulation of PLL-based circuits

2.1. Simulation of two-phase phase-locked loop

Let us consider the two-phase PLL operation ([22, 23]) (see Fig. 1). The input carrier is $\cos(\theta_{\text{ref}}(t))$ with

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Figure 1: Two-phase PLL model in the signal space

$\theta_{\text{ref}}(t)$ as a phase. Hilbert block shifts the phase of the carrier by 90° producing the output $\sin(\theta_{\text{ref}}(t))$. The voltage-controlled oscillator (VCO) generates $\sin(\theta_{\text{vco}}(t))$ and $\cos(\theta_{\text{vco}}(t))$. Figure 2 shows the structure of complex multiplier (phase detector). The phase detector consists of two analog multipliers and analog subtractor. The

Figure 2: Phase detector (complex multiplier) in the two-phase PLL

output of phase detector is as follows

$$v_{\text{pd}}(t) = \sin(\theta_{\text{ref}}(t) - \theta_{\text{vco}}(t)). \quad (1)$$

The relation between the input $v_{\text{pd}}(t)$ and the output $v_f(t)$ of the Loop filter has the following form

$$\dot{x} = Ax + bv_{\text{pd}}(t), \quad v_f(t) = c^*x + hv_{\text{pd}}(t), \quad (2)$$

where A is a constant $(n \times n)$ -matrix, $x \in \mathbb{R}^n$ is the Loop filter state, b and c are constant vectors, and h is a number. A widely used lead-lag filter is described by the transfer function

$$H(s) = c^*(sI - A)^{-1}b + h = \frac{a(s)}{d(s)} = \frac{1 + \tau_2 s}{1 + (\tau_1 + \tau_2)s}, \quad (3)$$

$$A = -\frac{1}{\tau_1 + \tau_2}, \quad b = 1 - \frac{\tau_2}{\tau_1 + \tau_2}, \quad c = \frac{1}{\tau_1 + \tau_2}, \quad h = \frac{\tau_2}{\tau_1 + \tau_2},$$

where $\tau_1 > 0$ and $\tau_2 > 0$ are parameters. The error signal $v_f(t)$ adjusts the VCO frequency to the frequency of the input signal:

$$\dot{\theta}_{\text{vco}} = \omega_{\text{vco}}^{\text{free}} + K_{\text{vco}}v_f(t), \quad (4)$$

where $\omega_{\text{vco}}^{\text{free}}$ is a free-running frequency of the VCO (i.e. for $v_f(t) \equiv 0$) and K_{vco} is the VCO input gain.

In contrast to the classical PLL-based circuits this model does not contain high-frequency components in the output of phase detector (complex multiplier). Therefore the two-phase PLL model in the signal space is equivalent to the model in the signal's phase space (Fig. 3). This model considers only phases θ_{vco} and θ_{ref} , and, thus, simplifies analytical and numerical study. The frequency of the input signal (reference frequency) is usually assumed to be

Figure 3: Two-phase PLL model in the signal's phase space

constant:

$$\dot{\theta}_{\text{ref}}(t) \equiv \omega_{\text{ref}}. \quad (5)$$

Introduce

$$\theta_e(t) = \theta_{\text{ref}}(t) - \theta_{\text{vco}}(t), \quad \omega_e^{\text{free}} = \omega_{\text{ref}} - \omega_{\text{vco}}^{\text{free}},$$

where $|\omega_e^{\text{free}}|$ is called a *frequency deviation*. Combining equations (1),(2),(3), and (4) we get the following equations of the model in the signal's phase space

$$\begin{aligned} \dot{x} &= \frac{-1}{\tau_1 + \tau_2} x + \left(1 - \frac{\tau_2}{\tau_1 + \tau_2}\right) \sin(\theta_e), \\ \dot{\theta}_e &= \omega_e^{\text{free}} - K_{\text{vco}} \left(\frac{1}{\tau_1 + \tau_2} x + \frac{\tau_2}{\tau_1 + \tau_2} \sin(\theta_e) \right). \end{aligned} \quad (6)$$

The equilibria points of (6) are defined as follows

$$x_{eq} = \tau_1 \sin(\theta_{eq}), \quad \sin(\theta_{eq}) = \frac{\omega_e^{\text{free}}}{K_{\text{vco}}} \quad (7)$$

and their local analysis can be done by the Routh-Hurwitz criterion. To study the global stability and the pull-in range we apply numerical methods.

Consider MATLAB Simulink model of the two-phase PLL (Fig. 4). We use the block *Loop filter* to take into account the initial filter state $x(0)$; the initial phase error $\theta_e(0)$ can be taken into account by the property *initial data* of the *Integrator* blocks.

The simulation results of the Loop filter output are shown in Fig. 5. If the *max step size* parameter is “auto”, then the simulation shows that the two-phase PLL synchronizes to the carrier (left subfigure). This fact suggests that ω_e^{free} belongs to the pull-in range. However, more precise simulation with the *max step size* set to “1e-4” shows that the Loop filter output does not synchronize to the carrier (right subfigure). Considered oscillations shows that ω_e^{free} can not belong to the pull-in range.

Now we consider the corresponding simulation in SPICE. Consider the two-phase PLL model in SPICE (Fig. 6). This model corresponds to Fig. 1 and Fig. 2. The model in Fig. 6 corresponds to the following NGSPICE listing¹:

```

1 *NGSPICE
2 V1 sin_input 0 0 Sine(0 1 1.5915494k 0 0)
3 V2 cos_input 0 0 Sine(0 1 1.5915494k
4   + -157.03518u 0)
5 R1 C2_N 0 1.85k
6 V3 vco_frequency 0 9.811k
    
```

¹Official ngspice web page <http://ngspice.sourceforge.net/>. Online realization is available at http://www.ngspice.com/index.php?public_circuit=AK3QmA

Figure 4: Realization of the two-phase PLL in MATLAB Simulink ($A \rightarrow A$, $b \rightarrow B$, $c \rightarrow C$, $h \rightarrow D$; $\omega_e^{\text{free}} \rightarrow \omega_{e_e}$, $K_{vco} \rightarrow K_vco$, $\omega_{\text{ref}} = 10000$).

```

7 R2 filter_out PD_output 4.48k
8 .subckt multiplier1 N1 N2 OUT
9 B1 OUT 0 V=V(N1)*V(N2)
10 .ends multiplier1
11 Xmult1 sin_input vco_cos_output ARB1.OUT
12 + multiplier1
13 *
14 .subckt multiplier2 N1 N2 OUT
15 B1 OUT 0 V=V(N1)*V(N2)
16 .ends multiplier2
17 Xmult2 cos_input vco_sin_output E3_CN
18 + multiplier2
19 *
20 .subckt sin_waveform N1 OUT
21 B1 OUT 0 V=sin(V(N1))
22 .ends sin_waveform
23 Xsin integrator_out vco_sin_output
24 + sin_waveform
25 *
26 .subckt cos_waveform N1 OUT
27 B1 OUT 0 V=cos(V(N1))
28 .ends cos_waveform
29 Xcos integrator_out vco_cos_output
30 + cos_waveform
31 *
32 .subckt integrator N1 OUT
33 Aintegrator N1 OUT time_count
34 .model time_count int(in_offset=0.0 gain=1.0
35 + out_lower_limit=-1e12
36 + out_upper_limit=1e12
37 + limit_range=1e-9 out_ic=0.0)
38 .ends integrator
39 Xintegrator integrator_in integrator_out
40 + integrator
41 *
42 E2 integrator_in 0 vco-frequency E2_CN 1
43 C2 filter_out C2_N 10u IC=50m
44 E3 PD_output 0 ARB1.OUT E3_CN 1
45 E6 E2_CN 0 filter_out 0 -250
46 * .TRAN 1m 5 0 1m UIC

```

Figure 5: Simulation of the two-phase PLL in MATLAB. Simulation of the same circuit shows qualitatively different results for different simulation steps (sampling, integration step). The left subfigure shows synchronization (step size “auto”), the right subfigure — oscillations (step size “1e-4”). Parameters: $K_{vco} = 250$, $A = -15.7978$, $B = 0.7077$, $C = 15.7978$, $D = 0.2923$ ($\tau_1 = 0.0448$, $\tau_2 = 0.0185$), $\omega_{a.e} = 178.9$, initial state of the Loop filter is $x(0) = 0.01$, $\theta_e(0) = 0$.

47 .TRAN 10m 5 0 10m UIC

The results of simulation are shown in Fig. 7. If the integration step in SPICE is equal to $10m$, then the simulation shows that VCO locks to the reference signal. The simulation with step $1m$ reveals oscillations. To consider the performance effect of additive white Gaussian noise (AWGN) added to the input signal one can use the following code-snippet for NGSPICE²:

```
1 E16 sin_noise 0 sin_input noise_1 1
2 E17 cos_noise 0 cos_input noise_2 1
3 V4 noise_1 0 0 TRNOISE(10m 100m 0 0)
4 V5 noise_2 0 0 TRNOISE(10m 100m 0 0)
```

In this example the two-phase PLL may lock or not lock depending on noise. Also to make the model more realistic one may consider non-linear VCO characteristic (see, e.g. example of hidden oscillations with non-linear VCO in [24]), the effect of frequency dependence of Hilbert transformer, and the effect of asymmetry of complex multiplier. However, for simplicity in this article we follow the classical analysis of the pull-in range [1, 2].

2.2. Simulation of the optical Costas loop

Consider the optical Costas loop model (see, e.g. [25]). The input signal is a BPSK (Binary Phase Shift Keying) signal, which is the product of the transferred data $m(t) = \pm 1$ and the harmonic carrier $\sqrt{P_{ref}} \sin(\theta_{ref}(t))$ with high frequency $\omega_{ref}(t) = \dot{\theta}_{ref}(t)$. The VCO signal is sinusoidal $\sqrt{P_{vco}} \sin(\theta_{vco}(t))$ with the frequency $\omega_{vco}(t) = \dot{\theta}_{vco}(t)$. Block 90° Hybrid has the following outputs:

$$\begin{aligned} E_1 &= \frac{1}{2} \left(m(t) \sqrt{P_{ref}} \cos(\theta_{ref}(t)) + \sqrt{P_{vco}} \cos(\theta_{vco}(t)) \right), \\ E_2 &= \frac{1}{2} \left(m(t) \sqrt{P_{ref}} \cos(\theta_{ref}(t)) - \sqrt{P_{vco}} \cos(\theta_{vco}(t)) \right), \\ E_3 &= \frac{1}{2} \left(m(t) \sqrt{P_{ref}} \cos(\theta_{ref}(t)) + \sqrt{P_{vco}} \cos(\theta_{vco}(t) + \frac{\pi}{2}) \right), \\ E_4 &= \frac{1}{2} \left(m(t) \sqrt{P_{ref}} \cos(\theta_{ref}(t)) - \sqrt{P_{vco}} \cos(\theta_{vco}(t) + \frac{\pi}{2}) \right). \end{aligned} \quad (8)$$

²Official ngspice web page <http://ngspice.sourceforge.net/>. Online realization is available at http://www.ngspice.com/index.php?public_circuit=Av4Mbb

Figure 6: Realization of the two-phase PLL model in SPICE.

 Figure 7: Simulation of the two-phase PLL in NGSPICE. For default simulation step (10m) the VCO synchronizes to the reference signal (left subfigure). For simulation step 1m an undamped oscillation exists (right subfigure). Parameters: $K_{vco} = 250$, $A = -15.7978$, $b = 0.7077$, $c = 15.7978$, $h = 0.2923$ ($\tau_1 = 0.0448$, $\tau_2 = 0.0185$), $\omega_e^{free} = 189$. Initial charge of capacitor C2 is 50m (corresponds to initial state of the Loop filter), $\theta_e(0) = 0$, $\omega_{ref} = 10000$.

Four outputs of the receivers are the following

$$\begin{aligned}
 I_1(t) &= \frac{R}{8} (P_{ref} + P_{vco} + 2m(t)\sqrt{P_{ref}P_{vco}}\cos(\theta_e(t))), \\
 I_2(t) &= \frac{R}{8} (P_{ref} + P_{vco} - 2m(t)\sqrt{P_{ref}P_{vco}}\cos(\theta_e(t))), \\
 I_3(t) &= \frac{R}{8} (P_{ref} + P_{vco} + 2m(t)\sqrt{P_{ref}P_{vco}}\cos(\theta_e(t) - \frac{\pi}{2})), \\
 I_4(t) &= \frac{R}{8} (P_{ref} + P_{vco} - 2m(t)\sqrt{P_{ref}P_{vco}}\cos(\theta_e(t) - \frac{\pi}{2})).
 \end{aligned} \tag{9}$$

The amplifier multiplies its inputs by a positive number a , and then two pairs of signals are subtracted:

$$\begin{aligned}
 I_I(t) &= aI_1(t) - aI_2(t) = \frac{m(t)Ra\sqrt{P_{ref}P_{vco}}}{2} \cos(\theta_e(t)), \\
 I_Q(t) &= aI_3(t) - aI_4(t) = \frac{m(t)Ra\sqrt{P_{ref}P_{vco}}}{2} \cos(\theta_e(t) - \frac{\pi}{2}).
 \end{aligned} \tag{10}$$

Figure 8: The optical Costas loop in the signal space

After the multiplication $\otimes$ the Loop filter input becomes

$$v_{pd}(t) = I_I(t)I_Q(t) = \frac{R^2 a^2 P_{ref} P_{vco}}{4} \cos(\theta_e(t)) \sin(\theta_e(t)) = \frac{R^2 a^2 P_{ref} P_{vco}}{8} \sin(2\theta_e(t)). \quad (11)$$

Combining equations (11), (2), (3), and (4) we get nonlinear model of optical Costas loop. This model corresponds to the classical signal's phase model of PLL shown in Fig. 3. Now we construct the corresponding model in MATLAB Simulink (see Fig. 9).

Figure 9: Signal's phase space model of optical Costas loop in MATLAB Simulink ($A \rightarrow A$, $b \rightarrow B$, $c \rightarrow C$, $h \rightarrow D$; $\omega_e^{free} = 353.5$, $K_{vco} = 500$, $\omega_{ref} = 10000$).

The simulation of optical Costas loop reveals the same effect, as in previous examples.

Figure 10: Simulation of the optical Costas loop in MATLAB Simulink (Fig. 9), Loop filter output. The left subfigure shows synchronization (step size “auto”), the right subfigure — oscillations (step size “1e-4”). Parameters: VCO input gain is $K_{vco} = 500$, $A = -15.7978$, $b = 0.7077$, $c = 15.7978$, $h = 0.2923$. Initial state of Loop filter is zero, $\theta_e(0) = 0$.

If the *max step size* parameter is “auto”, then simulation shows that the model of optical Costas loop synchronizes to the carrier (left subfigure) and, thus, the considered ω_e^{free} can correspond to the pull-in range. However, if the *max step size* is set to “1e-4”, then the Loop filter output does not synchronize to the carrier (right subfigure) and, thus, the considered ω_e^{free} is outside of the pull-in range.

2.3. Simulation of the BPSK Costas loop

Figure 11: BPSK Costas loop

Consider the BPSK Costas loop circuit [5, 26, 27], which is used for carrier recovery and signal demodulation (Fig. 11). The input signal is a Binary Phase-Shift Keying (BPSK) signal, which is the product of data $m(t)$ and carrier $\sin(\theta_{\text{ref}}(t))$. In the following analysis we are not interested in $m(t)$, therefore we consider $m(t) \equiv 1$. The input signal is multiplied by the VCO outputs $2\cos(\theta_{vco}(t))$ and $2\sin(\theta_{vco}(t))$:

$$\begin{aligned} I_1(t) &= 2\cos(\theta_{vco}(t))\sin(\theta_{\text{ref}}(t)), \\ Q_1(t) &= 2\sin(\theta_{vco}(t))\sin(\theta_{\text{ref}}(t)). \end{aligned}$$

The transfer functions of low-pass filters LPF are equal to $H(s) = \frac{1}{s+1}$ (i.e. $A = -a$, $b = a$, $c = 1$, $h = 0$). The product of outputs of low-pass filters $v_{pd}(t) = I_2(t)Q_2(t)$ is filtered by the Loop filter defined by (3). The VCO phase is defined by (4). The frequency of the input signal (reference frequency) is usually assumed to be constant, i.e.

$$\theta_{\text{ref}}(t) = \omega_{\text{ref}}t.$$

Figure 12: MATLAB Simulink model of BPSK Costas loop in the signal space ($A \rightarrow A$, $b \rightarrow B$, $c \rightarrow C$, $h \rightarrow D$; $\omega_e^{\text{free}} = 87.307$, VCO input gain is $K_{\text{vco}} = 250$, $\omega_{\text{ref}} = 10000$, $a = 1000$)

Therefore the BPSK Costas loop is described by the following equations

$$\begin{aligned} \dot{x}_1 &= -ax_1 + 2a \sin(\omega_{\text{ref}}t) \cos(\theta_{\text{vco}}(t)), \\ \dot{x}_2 &= -ax_2 + 2a \sin(\omega_{\text{ref}}t) \sin(\theta_{\text{vco}}(t)), \\ \dot{x} &= \frac{-1}{\tau_1 + \tau_2}x + (1 - \frac{\tau_2}{\tau_1 + \tau_2})x_1x_2, \\ \dot{\theta}_{\text{vco}} &= \omega_{\text{vco}}^{\text{free}} + K_{\text{vco}}(\frac{1}{\tau_1 + \tau_2}x + \frac{\tau_2}{\tau_1 + \tau_2}x_1x_2). \end{aligned} \quad (12)$$

The model of BPSK Costas loop in MATLAB is shown in Fig. 12. Here blocks “LPF” are modeled using Transfer Function element from the standard library.

In Fig. 13 the BPSK Costas loop model, simulated with relative tolerance set to 10^{-5} or smaller, does not acquire lock. However the model, simulated with standard parameters (the *max step size* set to “auto”), acquires lock after approximately 12 seconds. Here the input signal frequency is 10000, the VCO free-running frequency $\omega_e^{\text{free}} = 87.307$, the VCO input gain is $K_{\text{vco}} = 250$, the initial state of the Loop filter is $x(0) = 0$.

Figure 13: Simulation of the BPSK Costas loop in MATLAB. The Loop filter outputs $v_f(t)$ for the initial data $x_0=0$, $\theta_e(0)=0$, obtained for default “auto” max step size and max step size set to 10^{-5} . Parameters: $A = -15.7978$, $b = 0.7077$, $c = 15.7978$, $h = 0.2923$ ($\tau_1 = 0.0448$, $\tau_2 = 0.0185$), VCO input gain is $K_{\text{vco}} = 250$, $a = 1000$, $\omega_e^{\text{free}} = 87.307$.

Note that any initial state of the Loop filter less than 0.4 leads to a similar effect.

3. Hidden oscillations

Now we give mathematical explanation of the considered problems of simulation. An oscillation in a dynamical system can be localized numerically if the initial conditions from its open neighborhood lead to the long-time

behavior that approaches the oscillation. Such an oscillation (or a set of oscillations) is called an attractor, and its attracting set is called a basin of attraction. Thus, from a point of view of the numerical analysis of nonlinear dynamical models it is essential to classify an attractor as self-excited or hidden attractor depending on simplicity of finding its basin of attraction [18–20]: *An attractor is called a self-excited attractor if its basin of attraction intersects with an arbitrarily small open neighborhood of an unstable equilibrium, otherwise it is called a hidden attractor.*

For a self-excited attractor, its basin of attraction is connected with an unstable equilibrium and, thus, it can be localized numerically by a standard computational procedure in which after a transient process a trajectory, starting from a point in a neighborhood of the unstable equilibrium, reaches a state of oscillation and, therefore, visualizes the attractor. While many classical attractors are self-excited attractors and therefore can be obtained numerically by the standard computational procedure, for localization of hidden attractors it is necessary to develop special analytical-numerical procedures in which initial point is chosen from the basin of attraction. The numerical search of hidden attractors can be also complicated due to the small size of the basin of attraction with respect to the considered set of parameters and subset of the phase space (see, e.g. a discussion of rare hidden attractors in [28, 29]). For example, hidden attractors are attractors in the system without equilibria or in multistable system with only stable equilibria. During recent years it has been shown that hidden attractors may significantly complicate simulation of dynamical models, lead to unreliable results and wrong conclusions, and even cause serious damage in aircrafts control systems [30, 31], drilling systems [32–34], electromechanical systems [35], and other applications [36, 37]. Recent examples of hidden attractors can be found e.g. in [29, 35, 38–45].

Following pioneering works [1, 2], classical PLL-based circuits are often described by a models in the signal's phase space (rigorous justification can be done by the averaging methods, see, e.g. the corresponding discussion in [46–49]). One of the first analytical study of classical PLL circuit with lead-lag Loop filter in the signal's phase space was done in 1956 [50] by the phase-plane analysis. In this work Kapranov assumed that all oscillations in the considered two-dimensional model are self-excited. However, in 1961 Gubar' [51] revealed a gap in Kapranov's consideration and showed that in classical PLL circuit with lead-lag Loop filter a stable periodic trajectory, which is a hidden attractor, can exist and bound the basin of attraction of equilibria. This stable periodic trajectory (stable cycle) coexists with an unstable periodic trajectory (unstable cycle) and if the gap between these two trajectories is small (see Fig. 14a) and the discretization step (sampling) in numerical integration is larger than this gap, then the numerical integration may step over both stable and unstable periodic trajectories. We can avoid this problem if we choose simulation step much smaller than the distance between the cycles.

Figure 14: Phase portrait of PLL-based circuits dynamical model in the signal's phase space: (a) coexistence of stable periodic trajectory (which is a local hidden attractor — locally attracting, closed, and bounded set in cylindrical phase space) and unstable periodic trajectory close to each other; (b) semistable periodic trajectory.

The localization of hidden oscillation is shown in Fig. 5, Fig. 10, and Fig. 13 (right subfigures). The case corresponds to the close coexisting attractors and the bifurcation of birth of semistable trajectory (semistable cycle) [18, 51–53]. In this case the numerical methods are limited by the integration errors (see [54, 55]). However, the cycles may merge together and form semi-stable cycle (see Fig. 14b), which is difficult to reveal by the numerical procedure with any integration step.

Conclusion

The considered examples motivate to apply rigorous analytical methods for the global analysis of PLL-based circuits. As it was noted in [56] *stability in simulations may not imply stability of the physical control system and, thus, stronger theoretical understanding is required.*

For two-dimensional models of PLL-based circuits with first-order Loop filters, the phase-plane analysis can be effectively applied (see, e.g. [52]). For high-order filters and multi-dimensional models one can apply the corre-

sponding modifications of classical stability criteria for the nonlinear analysis of control systems in the cylindrical phase space (see, e.g. [4, 57]). However these methods give often only sufficient conditions and rough estimates. Thus, a comprehensive study of PLL-based circuits with high-order filters is a challenging problem.

Acknowledgment

This work was supported by Russian Science Foundation (project 14-21-00041p) and Saint-Petersburg State University. The authors would like to thank Roland Best (the founder of the Best Engineering Company, Oberwil, Switzerland and the author of the bestseller on PLL-based circuits [13]) and Giovanni Bianchi (Advantest Europe GmbH) for valuable discussion on PLL simulation.

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