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How to build a MATLAB demonstrator solving dynamical systems in real-time, with audio output and MIDI control

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¹ Summary

This paper explains and provides code to synthesize 2 and control, in real-time, the audio signals produced 3 by a dynamical system. The code uses only the Matlab 4 programming language. It can be controlled with an 5 external MIDI (Musical Instrument Data Interface) 6 device, such as a MIDI keyboard or wind controller, 7 or with mouse-operated sliders. In addition to the 8 audio output, the demonstrator computes and dis-9 plays the amplitude and fundamental frequency of the 10 signal, which is useful to quantify the dynamics of 11 the model. For the sake of this example, it is a type 12 of Van der Pol oscillator, but more complex systems 13 can be handled. The demonstrator holds potential for 14 pedagogical and preliminary research applications, for 15 various topics related to dynamical systems: direct and 16 inverse bifurcations, transient effects such as dynam-17 ical bifurcations, artifacts introduced by integration 18 schemes, and above all, the dynamics of self-sustained 19 musical instruments. 20

²¹ 1 Introduction

Autonomous dynamical systems are complicated ob-22 jects to study and teach. Even some of the simplest 23 ones to formulate are extremely unpredictable. The 24 richness of this behavior is not encapsulated in the 25 usual description of the permanent equilibrium points 26 or periodic regimes [1, 2]. Some of their solutions are 27 non-periodic, or coexist with other stable solutions [3]. 28 This makes it difficult to predict which type of solution 29 is obtained in any given situation. When the system 30 parameters vary, complicated transient effects emerge, 31 such as hysteresis cycles [4] or dynamical bifurcations 32 [5].33

Self-oscillating musical instruments such as wind 34 instruments or bowed strings are modeled using au-35 tonomous dynamical systems [6]. Their example illus-36 trates how transient effects are essential to a complete 37 description of the system's real-life behavior, since they 38 are experienced (at least) at the beginning and end of 39 each note. In this spirit, it seems that a reasonable and 40 compelling approach to experience and explore how 41 a dynamical system reacts is implementing a virtual 42

"musical instrument" demonstrator. By manipulating 43 the control parameters, the user can see and hear phe-44 nomena typical of nonlinear systems in real-time, in a 45 very controlled and repeatable environment. This is 46 particularly relevant in all fields related to music, such 47 as musical acoustics and instrument making. In these 48 fields, one can go even further by linking the system's 49 behavior to musical terms, such as intonation (flat, 50 sharp), nuance (piano, forte) or transient dynamics 51 (staccato, legato). The presented demonstrator aims 52 to be as general as possible, meaning that the example 53 model can be replaced by any simple dynamical system 54 with only minor adjustments. While other possible 55 environments for real-time sound synthesis exist, such 56 as C++ (notably the JUCE library), Max/MSP, or 57 Faust, this demonstrator is presented in a pure Mat-58 lab implementation, using only the Audio Toolbox 59 (audio_system_toolbox, matlab, signal_blocks). This 60 is advantageous for the many researchers who may 61 want to reuse their preexisting codes, solvers, systems, 62



Figure 1: Interface of the real time dynamical system demonstrator.

analysis or display tools. Note that the built-in Matlab tools necessary were not available before R2016a
(for the Audio toolbox and most of the elements of
the user interface) and R2018a (for the MIDI message

handling). 67 After a quick presentation of the dynamical system 68 used in the demonstrator in Section 2, the implemen-69 tation choices are detailed is Section 3. Ideally, the 70 authors wanted this paper to follow the actual lines 71 of codes implementing the demonstrator. Sadly, the 72 complete code is too lengthy for a journal paper (no-73 tably due to display functions, UI building and general 74 housekeeping). With the intent of being as explicit 75 as possible, Section 3 is built around several code 76 snippets addressing the main challenges of a real-time 77 audio demonstrator. The first of these code excerpts 78 is self-contained and functional, and outputs sound 79 generated by a dynamical system in real-time. The 80 structure of the rest of the section follows that of the 81 code, which is: 82

- Initialization of the audio output object (the current example uses the audiodevicewriter object).
- Construction of the user interface: buttons, sliders
 and MIDI device handling.

Execution of the synthesis loop, typically a while
 loop with generation of new sound samples, and
 output of the audio through the audio output
 object.

• Extraction of audio descriptors and display.

A link to the complete Matlab code is given in Appendix, as well as a compiled version with slightly
faster reaction to user controls obtained with the Matlab compiler.

⁹⁷ 2 A simple system

For this demonstration, we use a modified Van der
Pol oscillator with a quadratic and fourth power nonlinearity in the damping term. It can be seen as a
simplified model of self-sustained musical instrument.
Notably, some fingerings of the saxophone display a
similar dynamic [7].

The system is studied in its linear stiffness form in [8]. It is very close to the normal form of the Bautin bifurcation [9]. As such, its behavior is well-known, but rich enough so that it illustrates a good number of phenomena typical of autonomous nonlinear systems. The governing equation is

$$\ddot{x} + \left[\mu + \sigma(\dot{x}^2 + x^2) + \nu(\dot{x}^2 + x^2)^2\right]\dot{x} + x^{\alpha} = 0. \ (1)$$

Hereafter, we set $\nu = 0.5$ and $\alpha = 1$ (linear stiffness) or $\alpha = 3$ (cubic stiffness). The parameters μ and σ are controlled by the user. The amplitude of the oscillations can be approximated analytically as shown in [8], setting $x = X \cos(t)$, as

$$X = \sqrt{\frac{-\sigma \pm \sqrt{\sigma^2 - 4\mu\nu}}{2\nu}}.$$
 (2)

In the range of parameters explored here, this approx-115 imation is extremely precise. This formula gives the 116 blue surface in Figure 1. The system exhibits a Hopf bi-117 furcation at $\mu = 0$, meaning that a periodic oscillation 118 emerges from the equilibrium [10]. This corresponds 119 to the point at which the linear damping coefficient 120 changes sign. Hence, the linearized oscillator becomes 121 active (energy is created) when $\mu < 0$. The Hopf bi-122 furcation is supercritical for $\sigma > 0$ and subcritical for 123 $\sigma < 0$. There is a saddle-node bifurcation at $\sigma^2/(4\nu)$ 124 when $\sigma < 0$, marking the turning point where the un-125 stable and stable periodic solutions collapse together 126 [11]. The saddle-node bifurcation merges with the 127 Hopf bifurcation at $\sigma = 0$, forming the codimension 128 2 Bautin bifurcation [12]. This structure implies a 129 bistability zone, where both the equilibrium and an 130 oscillating (periodic) regime are stable. In this zone, 131 the user can experience the practical implications of 132 bistability around an inverse Hopf bifurcation, such 133 as hysteresis cycles or the impossibility to obtain an 134 oscillation of arbitrarily low amplitude. 135

A modified version of Eq. (1) is used, in order to produce several notes without changing the dynamics of the continuous-time system. With a new parameter ω_0 , the state-space representation of the system becomes 140

$$\dot{X} = \begin{pmatrix} \dot{x} \\ \dot{y} \end{pmatrix} = F(X)$$

$$= \omega_0 \begin{pmatrix} y \\ -x^{\alpha} - (\mu + (\sigma(y^2 + x^2) + \nu(y^2 + x^2)^2)y) \end{pmatrix}.$$
(3)
(3)
(3)
(3)
(4)

The time domain integration of Eq. (1) is realized us-141 ing three different discretization schemes. This demon-142 strate the versatility of the approach, and highlights 143 the influence of the discretization scheme. The user 144 can switch between schemes at any time. The simplest 145 discretization scheme is the explicit Euler method [13], 146 giving the n + 1-th values of x and y as a function of 147 the n-th: 148

$$x[n+1] = x[n] + \frac{\omega_0}{F_s} y[n] \tag{5}$$

$$y[n+1] = y[n] + \frac{\omega_0}{F_s} (-x[n]^{\alpha} - (\mu$$

$$+ (\sigma(y[n]^2 + x[n]^2) + \nu(y[n]^2 + x[n]^2)^2)y[n]).$$
(7)

The second method is a fourth-order Runge Kutta 149 (RK4) integration scheme [14]. Using the F notation 150 from Eq. 3, one computes the next sample by 151

$$X[n+1] = X[n] + \frac{1}{6F_s} \left(K_1 + 2K_2 + 2K_3 + K_4 \right)$$
(8)

$$K_1 = F(X[n])$$
 $K_2 = F(X[n] + \frac{K_1}{2F_s})$ (9)

$$K_3 = F(X[n] + \frac{K_2}{2F_s})$$
 $K_4 = F(X[n] + \frac{K_3}{F_s}).$ (10)

The third and last method is Matlab's built-in ode45 153 solver [15]. It is also a type of Runge-Kutta integration 154 scheme but with a auto-adaptive time step. 155

3 Implementation of the demon-156 strator 157

This section describes the implementation of the main 158 functionalities of the demonstrator. The complete 159 source code can be downloaded from the repository in 160 Zenodo https://doi.org/10.5281/zenodo.8413627 [16]. 161

Real-time audio on Matlab 3.1162

The current implementation uses the Audio toolbox 163 object audiodevicewriter, which communicates 164 with the audio driver of the computer. The Matlab 165 version used during the writing of this article is 2021a. 166 Fig. 2 is a self-contained, minimal working example 167 using the system from section 2 solved with ode45. 168 When running this code, please lower the volume as 169 the sound can be quite loud. 170

Note that, especially on Windows, best results are 171 obtained using ASIO drivers instead of the default 172 audio driver. In that case, the sample rate and buffer 173 size of the ASIO driver should be equal to those of the 174 Matlab audioDeviceWriter object. However, nu-175 merous different ASIO drivers exist depending on each 176 user's setup. Therefore, it is hard to provide a flexible 177 and compact ASIO-based solution. Users of the code 178 are encouraged to adjust the audioDeviceWriter 179 parameters to their particular hardware and driver. 180

3.2User interface 181

The user interface displayed in Figure 1 is comprised 182 of a main display graph, three control sliders (μ , σ 183 and $f_0 = \omega_0/(2\pi)$), two button groups setting the 184 integration scheme and the stiffness exponent α , and 185 four buttons for other user actions. 186

3.3Musical instrument control 187 through MIDI 188

A natural way to control the demonstrator is through 189 the MIDI protocol. This is especially relevant for any 190 191 kind of music-related interpretation, as external MIDI controllers allow to control the demonstrator like a 192 keyboard synthesizer or a wind instrument. In a more 193 general context, MIDI controllers allow for a more 194 fluid control than a mouse and slider. For instance, 195

MIDI controllers facilitate the simultaneous variation of several parameters.

Matlab's audio toolbox support MIDI through the mididevice object. First, the mididevice object 199 is created based on a user input given through the 200 MIDIlistbox object. 201

```
midicontroller = ...
    mididevice('Input',MIDIlistbox.Value);
```

Then, at every iteration of the synthesis loop (i.e. 202 before each audio buffer is filled with samples), the 203 pending MIDI message are gathered using 204

```
msgs = midireceive(midicontroller);
```

This gives an array of midimsg objects. They signal 205 control parameter changes or note changes, depending 206 on their type. This information can be retrieved by 207 accessing the Type property of the midimsg and com-208 paring it to another string, for instance 'NoteOn' or 209 'ControlChange' (CC). This is slower (sometimes by a 210 factor of ten) than directly reading and comparing the 211 bytes of the messages, which hold the same informa-212 tion. The gain in speed is especially interesting in the 213 case of a wind controller, which sends ControlChange 214 messages very often to translate the blowing pressure 215 of the musician. An array of the message bytes is 216 created by 217

msgsbytes = vertcat(msgs.MsgBytes);

and then parsed using the first byte as the message 218 type identifier (176 for ControlChange, 144 for No-219 teOn). In the case of ControlChange, the second byte 220 in the array indicates the CC number. Different CC 221 numbers can be linked to different parameters. For 222 example, parameter μ is linked to CC number muCC 223 (2 by default), which is parsed from the MIDI message 224 bytes by 225

```
imsqCCmu = find((msqsbytes(:,1)==176)...
       &(msgsbytes(:,2) == muCC),1, 'last');
```

In order to apply only the most recent user-provided 226 command, only the last message is read. The new 227 value of the control is contained in the third byte of 228 that message (at index imsgCCmu in the array): 229

newCCmu = double(msgsbytes(imsgCCmu,3));

This value, scaled between the control parameter limits, 230 gives the new control parameter value. 231

4 Synthesis loop

Each iteration of the synthesis loop produces enough 233 audio samples to fill one audio buffer. Its structure in 234 pseudocode is 235

while (stopbutton is not pushed) Read user controls Solve equation during one audio buffer Format solution as audio output Extract signal descriptors from solution Update display

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```
nu = 0.5; sigma = -0.5; mu = -0.5; Nbuf = 512; w0 = 2*pi*440; Fs = 44100;
ADW = audioDeviceWriter(Fs);
X = [1;1]; t = (0:Nbuf)/Fs;
while 1,
    [t,Xs]=ode45(@(t,X) w0*[X(2);-X(1)-(mu+sigma*(X(2)^2+X(1)^2)+nu*(X(2)^2+X(1)^2)^2)*X(2)],t,X.');
    X = Xs(end,:);
    ADW(Xs(2:end,:));
end
```

Figure 2: Minimal working example solving the oscillator of section 2 in real-time, and outputting the audio stream. This code can be copy-pasted directly to the Matlab command window (depending on the pdf font used the " ^ " power character needs to be manually rewritten). It is also provided as an M-file in the code archive that can be downloaded in the Appendix.

```
Record solution
Output sound
Check pending displays or callbacks
end
```

The following subsections detail each line of this pseu-docode block.

238 4.1 Read user controls

User controls are read using either the MIDI messages 239 or the sliders. There are three methods to assign the 240 value of a slider to a variable. First, it is possible to 241 check the Value property of the slider on each loop 242 iteration. This is done for the f_0 parameter. This 243 solution is very close to using the ValueChangedFcn 244 callback. In both cases, the changes are applied when 245 the user releases the slider thumb. The third solution 246 is the slider callback function ValueChangingFcn, 247 which is called while the user moves the slider. This 248 solution is necessary to render progressive variations 249 of the parameters. The control parameters μ and σ 250 are updated with this method. This is useful to follow 251 a quasi-static path along the bifurcation diagram, or 252 execute a slow attack through the Hopf bifurcation. 253

The button values are read and stored in separate variables, to be used in the loop.

4.2 Solve equation during one audio buffer

Depending on the structure of the solver function, this
step can take two forms. If the solver sets its own
time-step, and a fortiori if it is auto-adaptive (like
ode45), the solver function is called once to generate
the total number Nbuf of samples in one audio buffer.
This is implemented as

```
[~,Xts] = ode45(@(t,Xt) VanDerPol5_odefun(...
Xt,t,mu,nu0,sigma,2*pi*f0),(0:Nbuf)/Fs,X.');
X = Xts(end,:);
positions = Xts(2:end,1);
speeds = Xts(2:end,2);
```

 $_{264}$ Note that the initial condition X is returned as the first

 $_{\rm 265}$ $\,$ line of the solution Xts. However, it is (by definition) $\,$

the last line of previous solution. Repeating it twice in
 the audio stream causes clicks and artifacts. Therefore,

ode45 is called for Nbuf+1 time steps, and only the last Nbuf constitute the audio output.

If, on the contrary, the solver simply gives X[n+1] as a function of X[n] (like the RK4 and explicit Euler schemes), it is called Nbuf times. Then, the solving step is

```
for ibuf = 1:Nbuf
    X_np1 = VanDerPol5_backwardsEuler(...
        X,mu,nu0,sigma,2*pi*f0,Fs);
    X = X_np1;
    positions(ibuf) = X(1); speeds(ibuf) = X(2);
end
```

We use a test to estimate the maximum number 274 of oscillators that can be integrated simultaneously. 275 The test is done with no user interface or separate 276 display. It uses 44.1 kHz sample rate and a 512 sam-277 ple buffer. On the laptop this was implemented on, 278 between 3 and 9 ode45-solved oscillators can run in 279 parallel while keeping a fluid audio flux (depending 280 on power consumption options). Between 4 and 12 281 parallel oscillators run with the RK4 solver. Using a 282 simpler explicit Euler scheme allows between 28 and 283 82 oscillators to run in parallel. This gives an idea 284 of the headroom of this architecture to accommodate 285 bigger systems. As this result heavily depends on the 286 user's hardware, the code to reproduce this test is 287 given in the code archive linked in the Appendix, so 288 each user can know their potential for more complex 289 systems. 290

4.3 Format solution as audio output

The solution of the equation must fit inside a Nbuf-292 by-two matrix, which is passed as argument to the 293 audiodevicewriter object. Here, for this simple 294 system, minimal processing is applied. The solution 295 is scaled by Xmax, an analytical estimate of the maxi-296 mum amplitude for the considered control parameter 297 range. The left and right channel are passed x and y298 respectively. This way, a direct xy plot of the audio 299 output represents the phase space of the oscillator. 300

audioout = [positions(:) speeds(:)]/Xmax;

In a more general case, it can be useful to listen to certain physical variables rather than others, or process them in a specific manner (filtering or nonlinear

³⁰⁴ processing) for illustrative or aesthetic purposes.

4.4 Extract signal descriptors from so lution

Only basic signal descriptors are extracted in this 307 demonstrator: RMS amplitude (or rather, mean dis-308 tance to the origin in the phase space) and fundamental 309 frequency. The RMS amplitude is used as the main 310 display indicator. For this system, it is sufficient to 311 differentiate solution branches and locate bifurcations. 312 The fundamental frequency estimate is computed by a 313 simplistic algorithm based on zero-crossings. It helps 314 to quantify the detuning effect of the different integra-315 tion schemes, and of the cubic stiffness. 316

317 4.5 Update display

Any systematic real-time display concurrent with an audio process on Matlab needs to be kept as light as possible to not perturb the audio flux. This demonstrator updates a plot with a single point, and an animatedline object inside the loop. These graphical objects represent the current and recent RMS amplitude of the solution.

325 4.6 Record solution if necessary

A button on the interface records the descriptors, con-326 trol parameters and button values in a structure once 327 per loop iteration. In the present demonstrator, no 328 variable at audio rate is recorded. This prevents ex-329 cessive memory usage and disk access in the event of 330 a long recording. The data is saved in a mat-file. It is 331 also used as soon as the recording is stopped to provide 332 a multipurpose plot designed to support a quick analy-333 sis of the results. An example of this plot is displayed 334 in Figure 3, where the effect of the integration scheme 335 on fundamental frequency is illustrated. Starting with 336 the RK4 solver, the following parameter variation is 337 applied: beginning at $\mu = 0.5$ and $\sigma = 0.5$, the μ pa-338 rameter is decreased slowly to its minimum $\mu = -0.5$, 339 followed by parameter σ which also decreases until 340 around $\sigma = -0.6$. At this point, the RMS value of 341 the oscillation is at its highest point. The parameters 342 σ and then μ are then slowly brought back to their 343 initial values. This scenario is repeated with ODE45, 344 starting from approximately 22s, and with the explicit 345 Euler scheme, starting from approximately 39s. One 346 can see on the fundamental frequency subplot that the 347 RK4 scheme provides the most consistent fundamen-348 349 tal frequency, followed closely by the ODE45 solver where variations do not exceed 1 Hz around the 440 Hz 350 expected frequency (i.e. the eigenfrequency of the lin-351 earized oscillator). However, the explicit Euler scheme 352 entails considerable pitch flattening when the signal 353

amplitude increases, down to about -6 Hz (about -20 354 cents) from the expected frequency. 355

356

4.7 Output sound

The audiodevicewriter object is used to output audio. It is also responsible for the scheduling of the loop. 359

ADW (audioout);

4.8 Check pending displays or callbacks 360

The execution of user interface object callbacks and ³⁶² refreshing of the display is ensured by the command ³⁶³ drawnow limitrate placed at the end of the loop. ³⁶⁴ A simple drawnow would degrade the audio output by introducing too many pauses, but drawnow ³⁶⁶ limitrate limits the number of pauses to 20 per second. This is essential to keep a robust audio stream. ³⁶⁸



Figure 3: Example of the multipurpose plot created at the end of each recording, illustrating the fundamental frequency variation due to different integration schemes. See section 4.6 for details.

³⁶⁹ 5 Video demonstration

The video, also linked in the caption of Fig 4, illustrates possible uses of the demonstrator, and showcases the

³⁷² fluidity of the controls.



Figure 4: A snapshot of the illustrative video linked at https://youtu.be/_ExgRsgB7wc (until a more stable host is determined).

373 6 Conclusion

The presented demonstrator holds a lot of potential for 374 teachers and researchers combining dynamical systems 375 with audio engineering or music. In terms of teaching, 376 it illustrates transient effects in direct and entertaining 377 ways. It can also be useful for proof of concepts, to 378 quickly assess the behavior of a dynamical system, or 379 to compare two slightly different versions (parameter 380 values, physical hypotheses or integration scheme). 381

Because it relies solely on Matlab, any researcher 382 that has mainly been coding in Matlab can reuse their 383 usual tools. In particular, we show that a continuous-384 time formulation of a system can be sufficient to pro-385 duce sound, simply leaving the integration to a built-in 386 method such as ode45. There is also reasonable head-387 room to adapt the demonstrator to a more complex 388 system, especially if one is willing to simplify the inte-389 gration scheme. 390

In music-related fields, this kind of demonstrator is 391 all the more interesting as it bridges the gap between 392 the physical model of an instrument and the actual 393 instrument, by allowing to control a model with any 394 musical controller supporting the MIDI protocol. The 395 authors strongly believe in the potential of the real-396 time physical model control as a way to contribute to 397 an objective definition of the 'playability' or 'ease of 398 playing' of a musical instrument. 399

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Data Availability Statement

The source code and .exe installer file for 406 well demonstrator. as M-files reprothe as 407 ducing results for sections 3.1 and 4.2, can 408 be downloaded from the repository in Zenodo 409 https://doi.org/10.5281/zenodo.8413627. 410

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