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# A Study of the Passive Gait of a Compass-Like Biped Robot: Symmetry and Chaos

## Abstract

*The focus of this work is a systematic study of the passive gait of a compass-like, planar, biped robot on inclined slopes. The robot is kinematically equivalent to a double pendulum, possessing two kneeless legs with point masses and a third point mass at the "hip" joint. Three parameters, namely, the ground-slope angle and the normalized mass and length of the robot describe its gait. We show that in response to a continuous change in any one of its parameters, the symmetric and steady stable gait of the unpowered robot gradually evolves through a regime of bifurcations characterized by progressively complicated asymmetric gaits, eventually arriving at an apparently chaotic gait where no two steps are identical. The robot can maintain this gait indefinitely.*

*A necessary (but not sufficient) condition for the stability of such gaits is the contraction of the "phase-fluid" volume. For this frictionless robot, the volume contraction, which we compute, is caused by the dissipative effects of the ground-impact model. In the chaotic regime, the fractal dimension of the robot's strange attractor (2.07) compared to its state-space dimension (4) also reveals strong contraction.*

*We present a novel graphical technique based on the first return map that compactly captures the entire evolution of the gait, from symmetry to chaos. Additional passive dissipative elements in the robot joint result in a significant improvement in the stability and the versatility of the gait, and provide a rich repertoire for simple control laws.*

## 1. Motivation

Biped robots and other legged robots are potentially better suited than wheeled vehicles to the maintenance of hazardous environments (such as nuclear and chemical reactors), ex-

ploration of unstructured and unpaved terrains (for example, ocean floors, polar regions, lunar and Martian surfaces), deep-forest logging, fruit harvesting, and so on. At present, one of the main obstacles to a wider application of legged robots is their lack of energy efficiency. In comparison, their biological analogues demonstrate impressive energy economy during a normal walking gait; in fact, EMG studies (McMahon 1984; Rose and Gamble 1994) have shown that relative muscle inactivity during the swing phase of the human walk makes it almost passive. This illustrates the superiority of the biological control strategy, which functions in harmony with the natural inertial dynamics of the body in the gravitational field.

The long-term motivation behind the current study is to formulate a simple, biologically inspired active-control law for a 17-DOF biped robot (Espiau 1997) being built for Project BIP, which is coordinated by the INRIA laboratory in Grenoble, France. The control of such a highly nonlinear dynamic system coupled with the well-known stability issues common to all bipeds represents a major challenge. Experience shows that control strategies unconcerned with the system dynamics fail to take advantage of the benevolent dynamics inherent in the controlled system, and risk being a control overkill. To gain a better understanding of the dynamics of biped locomotion, we find it instructive to first explore the behavior of a simple walker model.

Physical models (McGeer 1990; Coleman and Ruina 1998) and theoretical and simulated results (Goswami, Espiau, and Keramane 1997; Garcia, Chatterjee, Ruina, and Coleman 1998) have demonstrated that even passive biped robots with simple kinematics can successfully walk down an inclined slope in a steady gait. The motive power of such robots comes from the conversion of the robot's gravitational potential energy as it descends down the slope. A delicate balance between the kinetic energy available from the conversion of

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potential energy and that absorbed due to ground impact ensures the maintenance of the steady gait. The particular gait adopted by the robot depends on the ground slope, as well as its geometric and inertial parameters.

The existence of natural-locomotion regimes in such simple machines suggests the possibility that an attentive but minimal control system based on a tuned dynamic system might represent the most judicious choice for controlling biped robots in complex environments.

### 1.1. What Is a Compass Gait?

The biped robot model studied in this paper is the so-called compass-gait model. The gait is so named because the locomotion produced with this model is analogous to the movement of a pair of compasses or dividers. The Cartesian hip trajectory consists of a series of circular arcs centered around the support leg's point of contact with the ground, and having a radius equal to the leg length. A particularly useful analysis of the human gait (Rose and Gamble 1994) decomposes the entire gait mechanism into six elementary "determinants," each involving a single degree of freedom in one of the joints. The compass gait is the first determinant of the gait, and it is the simplest kinematics that may exhibit a bipedal walking gait. Despite its simplicity, on a descending slope a passive compass-gait robot may exhibit "dynamic gait" (McGeer 1990), which means that its center of mass is not constrained to stay atop its foot-support point. This feature is normally associated with the anthropomorphic gait, and is attributed to a superior control performance.

The robot model, discussed in greater detail in Section 2.1, consists of two kneeless legs, each having a point mass, and a third point mass coincident with the hip joint. The Acrobot (Berkemeier and Fearing 1992; Spong 1995) and the Pendubot (Block and Spong 1995) are also based on the same double-pendulum kinematics, although they do not possess the hip mass. Hurmuzlu and Moskowitz (1986) and Yang (1994) present studies of other kneeless bipeds with an additional body mass connected to the hip through a pelvic joint. In Hurmuzlu and Moskowitz's (1986) work, particular attention was paid to the effect of the robot's impact with the ground, and the impact conditions were justifiably considered as an integral part of the governing equations. Bipeds with very simple dynamics were also constructed (Kato and Mori 1984; Grishin, Formal'sky, Lensky, and Zhitomirsky 1994; Formal'sky 1997). These models have telescopically retractable legs. The former of this is a 3-DOF model with independently adjustable leg lengths, whereas in the latter two, the sum of the leg lengths is mechanically constrained to be constant. Each of the robot models mentioned in this paragraph has some form of actuation.

The literature on *passive* bipedal walk is relatively limited. Inspired by the research on ballistic walking (Mochon and McMahon 1981), McGeer (1990) studied and built passive-

dynamic robots with and without knees. The physical models of these robots demonstrate the remarkable elegance and simplicity of unpowered walking on inclined slopes. A linearized dynamic model of the robot was considered for the analysis of the gait. The effect of variation of few design parameters on the walking performance was studied, including the height of the leg's center of mass, the hip mass fraction, and the leg-length mismatch. A leg-length mismatch caused, expectedly, a two-period gait. Curiously, for a larger mismatch, a four-period gait was found.

More recently, a systematic study of the full nonlinear equations of a simple compass-like, passive, biped robot was considered (Goswami, Espiau, and Keramane 1996, 1997; Goswami, Thuijlot, and Espiau 1996; Thuijlot, Goswami, and Espiau 1997). Goswami, Espiau, and Keramane (1996) associated the steady motion of the robot with a phase-plane limit cycle (following Kato and Mori [1984] and Hurmuzlu and Moskowitz [1986]); this group was the first to report the occurrence of a period-doubling bifurcation for this robot. Precursors to the current paper, Goswami, Thuijlot, and Espiau (1996) and Thuijlot, Goswami, and Espiau (1997) studied the effects of a parameter change on the gait of the robot. In response to a parameter change, the robot gait was found to exhibit a period-doubling cascade, finally leading to chaotic motion. The fractal dimension of the chaotic attractor was measured.

In other recent work, Garcia et al. (1998) considered an even simpler biped model, the "point-foot walker," which is also based on the same double-pendulum kinematics. As explained later, their model can be obtained as a simpler special case of the compass-gait model that is considered here. The significant reduction in the complexity of the model permits an analytical computation of initial conditions and the stability estimates of one-period gaits. The authors independently found the occurrence of period doubling, and were the first to find a chaotic gait in this model. Coleman and Ruina (1998) developed a simple 3-D passive-dynamic Tinkertoy device that walks.

### 1.2. Summary of Results

This paper presents a systematic study of the passive bipedal gait of a compass-like robot in response to continuous changes in its motion-determining parameters. Three parameters, namely, the ground-slope angle and the normalized mass and length describe the robot's dynamic behavior.

As a first guess for the initial states of the robot that will lead it to a stable limit-cycle gait, we use the prediction based on the linear model. Once a phase space-limit cycle is found, we can numerically prove its stability by calculating the Jacobian matrix of the Poincaré map of the limit cycle, as was done for the "stride function" (McGeer 1990). Contraction of phase-space volumes is known as a necessary (but not sufficient) condition for the asymptotic stability of dynamic systems.

For our otherwise frictionless robot, the volume contraction is caused by the foot-ground collisions. We quantify the dissipative effects of the ground-impact model by measuring the phase-fluid volume contraction.

A small change in a parameter normally results in small changes in the robot's gait, while its global qualitative behavior remains intact. We find that both the robot's step period and step length increase with an increase in any of the three parameters. The robot's translational velocity, however, increases with increased slope and normalized mass, but decreases with the normalized length. Also, most of the quantities describing the robot gait are monotonic functions of the three parameters.

However, there are situations when as one of the parameters exceeds a certain limiting value, a so-called *structural instability* sets in. This is manifested by a large-scale qualitative change in the gait. These structural instabilities are associated with period-doubling bifurcations in the solution of the robot's governing equations. As the parameter continues to change, the system may undergo a cascade of repeated bifurcations, and may, in the long run, exhibit chaotic behavior. Many of the tell-tale signs of chaos, such as a "broad-band frequency," similar but nonidentical cycles, and a densely packed attractor are all exhibited by these latter gaits.

We present a novel graphical technique based on the first return map that compactly captures the entire evolution of the gait, from symmetry to chaos. The fractal dimension of the attractor is computed to be 2.07. For a system with a four-dimensional state space, this indicates strong phase-space volume contraction.

Additional passive dissipative elements in the robot joint result in a significant improvement in the stability and versatility of the gait, and provide a rich repertoire for simple control laws.

## 2. Modeling

### 2.1. Robot Model and Modeling Assumptions

Figure 1 shows a sketch of a compass-like biped robot. The details of the model and the underlying assumptions are listed below:

**Mass:** Concentrated at three points:

- mass  $m_H$  at the hip, and
- masses  $m$  on each leg, located at distances  $a$  and  $b$  from the leg tip and the hip, respectively.

The total mass of the robot  $m_C = 2m + m_h$  is constant and equal to 20 kg, whereas the *mass ratio*  $\mu = \frac{m_H}{m}$  varies from 0.1 to 10 during the simulation trials.

**Leg:** The legs are identical. The leg length  $l = a + b$  is constant and equal to 1 m, whereas the *length ratio*  $\beta = \frac{b}{a}$  varies from 0.1 to 10 during the simulation trials.

**Actuation:** The robot is unactuated.

**Ground:** The robot walks down on a plane surface inclined at a constant angle  $\phi$  with the horizontal.

**Gait:** The motion is constrained in the sagittal plane, and consists of the following two stages:

- **Swing:** during this stage, the robot hip pivots around the point of support on the ground of its *support leg*. The other leg, called the *nonsupport leg* or the *swing leg* swings forward (the compass robot in Fig. 1 is in the swing stage).
- **Transition:** this occurs instantaneously when the swing leg touches the ground and the previous support leg leaves the ground.

**Ground impact:** The impact of the swing leg with the ground is assumed to be slipless plastic. This implies that during the instantaneous transition stage (see, for instance, the work of Hurmuzlu and Chang [1992]):

- the robot configuration remains unchanged, and
- the angular momentum of the robot about the impacting foot as well as the angular momentum of the pre-impact support leg about the hip are conserved. These conservation laws lead to a discontinuous change in robot velocity.

**Prismatic-joint knee:** This is a purely imaginary concoction, meant to address the conceptual problem of foot-clearance common to all kneeless planar bipeds. The prismatic joint is assumed to retract the lower leg to clear the ground. The retraction of the lower leg, which is assumed massless, does not affect the robot dynamics. The swing leg returns to its original length  $l$  at transition. Our emphasis here is on the simplicity of the model, rather than its physical realizability. Note, however, that physical models of robots of this type were developed and studied by Katoh and Mori (1984) and Grishin et al. (1994).

**Nominal model:** Although we study the passive gait of the robot for a range of parameters specified earlier, certain results in this paper are centered around a nominal robot model that corresponds to  $\mu = 2$  and  $\beta = 1$ . For results involving other models, the parameters of the robot will be specified.

During swing, the robot configuration can be described by  $\theta = [\theta_{ns}, \theta_s]^T$ , where  $\theta_{ns}$  and  $\theta_s$  are the angles made, respectively, by the nonsupport (swing) leg and the support leg with the vertical (counterclockwise positive). The state vector  $q$  associated with the robot is

$$q = [\theta, \dot{\theta}]^T = [\theta_{ns}, \theta_s, \dot{\theta}_{ns}, \dot{\theta}_s]^T. \quad (1)$$

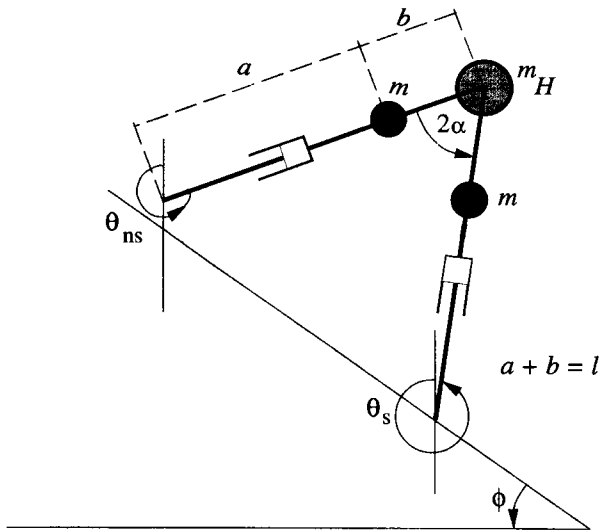


Fig. 1. Sketch of a compass-like biped robot on a slope. The robot consists of two kneeless legs, each having a point mass, and a third point mass coincides with the hip joint. The prismatic-joint knee shown in the picture is an imaginary con-connection meant to avoid the conceptual foot-clearance problem. See Section 2.1 for details.

During transition, since both legs are in contact with the ground, the robot configuration can be completely described by the half interleg angle  $\alpha$ , or equivalently by the step length  $L$ , defined as the distance between robot feet;  $\alpha$  and  $L$  are related by  $L = 2l \sin \alpha$ .

Before leaving this section, let us provide the definitions of certain terms that we frequently use in this paper. A gait is *symmetric* if any two consecutive steps are indistinguishable, that is, all the spatiotemporal variables exactly repeat themselves in each step. When a gait does not possess this property, it is said to be *asymmetric*. A gait is *periodic* if all the spatiotemporal variables repeat themselves after every  $p$  step. The integer  $p$  is called the *gait period*. For symmetric gaits,  $p = 1$ . In case of a  $p$ -period gait, the *gait cycle* consists of  $p$  successive steps. The term *steady gait* is loosely used to mean that the robot can walk indefinitely without falling down. The *step period* is the time required to take a *step*, that is, the time between the takeoff of one foot from the ground and its subsequent landing.

As the robot walks, the forward component of velocity of its center of mass changes continuously (as in human locomotion). Therefore, we introduce the term *average speed of progression* of the robot, denoted as  $v$ , to quantify its forward movement averaged over a cycle. In case of a  $2^n$ -period gait,  $v$  is a constant. When  $n = 0$  (i.e., symmetric gait),  $v$  is expressed as  $\frac{L}{T}$ , where  $T$  is the step period. For larger values of  $n$ ,  $v$  is the value of  $\frac{L_k}{T_k}$  (where  $k$  is a step counter) averaged over  $2^n$  consecutive steps. For a chaotic gait, the average speed of

progression can be calculated over a certain number of steps, and its exact value will be bounded but varying.

## 2.2. Governing Equations

The governing equations of the robot consist of nonlinear differential equations for the swing stage, and algebraic equations for the transition. The equations are well known (see, for example, work by Goswami, Thuilot, and Espiau [1996]). Here we simply present the symbolic form of the equations expressed in terms of the normalized parameters  $\mu$  and  $\beta$ . As is true in general, the study of governing equations of the robot in terms of normalized parameters brings in significant advantages. The swing-stage robot equations, similar to that of a frictionless double pendulum, can be written as

$$M(\theta)\ddot{\theta} + N(\theta, \dot{\theta})\dot{\theta} + \frac{1}{a}g(\theta) = 0, \quad (2)$$

where  $M(\theta)$ ,  $N(\theta, \dot{\theta})$ , and  $g(\theta)$  depend only on  $\mu$  and  $\beta$ , and not on  $m$ ,  $m_H$ ,  $a$ , and  $b$ :

$$M(\theta) = \begin{pmatrix} \beta^2 & -(1+\beta)\beta \cos 2\alpha \\ -(1+\beta)\beta \cos 2\alpha & (1+\beta)^2(\mu+1)+1 \end{pmatrix}, \quad (3)$$

$$N(\theta, \dot{\theta}) = (1+\beta)\beta \sin(\theta_s - \theta_{ns}) \begin{pmatrix} 0 & \dot{\theta}_s \\ -\dot{\theta}_{ns} & 0 \end{pmatrix}, \quad (4)$$

$$g(\theta) = \begin{pmatrix} g\beta \sin \theta_{ns} \\ -((\mu+1)(1+\beta)+1)g \sin \theta_s \end{pmatrix}. \quad (5)$$

The algebraic transition equations relate the robot's states just before and just after its collision with the ground. The support and the nonsupport legs switch during transition. The pre-impact and the post-impact configurations of the robot can be simply related by  $\theta^+ = J\theta^-$ , where  $J$  is a  $2 \times 2$  antisymmetric matrix with unit elements. The  $-$  and the  $+$  signs denote the state variables, respectively, before and after the collision. The conservation of angular momentum principle applied to the robot gives us  $Q^-(\alpha)\dot{\theta}^- = Q^+(\alpha)\dot{\theta}^+$ , from which we can write the joint-velocity relationship  $\dot{\theta}^+ = (Q^+(\alpha))^{-1}Q^-(\alpha)\dot{\theta}^- = H(\alpha)\dot{\theta}^-$ , where

$$Q^-(\alpha) = \begin{pmatrix} -\beta \\ 0 \\ -\beta + (\mu(1+\beta)^2 + 2(1+\beta)) \cos 2\alpha \\ -\beta \end{pmatrix}, \quad (6)$$

$$Q^+(\alpha) = \begin{pmatrix} \beta(\beta - (1+\beta) \cos 2\alpha) \\ \beta^2 \\ (1+\beta)((1+\beta) - \beta \cos 2\alpha) \\ +1 + \mu(1+\beta)^2 \\ -\beta(1+\beta) \cos 2\alpha \end{pmatrix}. \quad (7)$$



The complete state vector  $q$  before and after impact can thus be written as

$$q^+ = W(\alpha)q^-, \quad (8)$$

with matrix  $W(\alpha) = \begin{pmatrix} J & 0 \\ 0 & H(\alpha) \end{pmatrix}$ .

It can be shown that the gait characteristics of a robot with arbitrary masses  $m'$  and  $m'_H$  can always be deduced from those of a robot whose masses are in the same proportion  $\mu$  (Goswami, Thuijot, and Espiau 1996). More precisely, the gait characteristics of two different robots, with masses  $(m', m'_H)$ , and  $(m, m_H)$ , such that  $\frac{m'}{m} = \frac{m'_H}{m_H} = k_m$  are described in the table below.

Robot with Masses $m$ and $m_H$	Robot with Masses $m'$ and $m'_H$
$q, \alpha, L, T, v$ $E, \Delta E$	$q, \alpha, L, T, v$ $k_m E, k_m \Delta E$

Here,  $E$  refers to the total mechanical energy of the robot, and  $\Delta E$  is the absorption of energy during the ground impact.

In a similar manner we can show (Goswami, Thuijot, and Espiau 1996) that the gait characteristics of a robot with arbitrary lengths  $a'$  and  $b'$  can always be deduced from those of a robot whose lengths are in the same proportion,  $\beta$ . More precisely, the gait characteristics of two different robots, with lengths  $(a, b)$  and  $(a', b')$ , such that  $\frac{a'}{a} = \frac{b'}{b} = k_a$  are described in the table below.

Robot with Lengths $a$ and $b$	Robot with Lengths $a'$ and $b'$
$\theta$	$\theta$
$\dot{\theta}$	$\frac{1}{\sqrt{k_a}} \dot{\theta}$
$\alpha$	$\alpha$
$L$	$k_a L$
$T$	$\sqrt{k_a} T$
$v$	$\sqrt{k_a} v$
$E$	$k_a E$
$\Delta E$	$k_a \Delta E$

The dynamic model of the robot can therefore be parameterized by  $\mu$  and  $\beta$ . Note here that the ground slope  $\phi$ , which does not explicitly enter into the governing equations, completes our set of parameters. The effects of these three parameters on the gait characteristics of the passive biped robot are analyzed subsequently.

### 3. Stable Passive Gait and Limit Cycle

Typically, the governing equations for these robots are *hybrid* in the sense that they consist of nonlinear differential

equations describing the swing stage and algebraic relationships characterizing the switch between two successive swing stages. The ground slope can be imagined to impose an external geometric constraint in the configuration space of the robot, and the switching conditions can be viewed as the result of the robot touching the constraint. The physical model on which the switching conditions are based determines the physical nature of the robot's interaction with the constraint. Changing the ground slope modifies the geometric constraint, thereby fundamentally influencing the robot gait. The rich dynamics exhibited by the robot is the result of an interplay between the continuous and the algebraic parts of its governing equations.

#### 3.1. Analytical Approach versus Simulation

Although the robot has a simple kinematics, the hybrid nature of the governing equations makes it impossible to utilize the traditional tools (such as the automatic detection of limit cycles [Parker and Chua 1989]) developed to aid the study of nonlinear systems.

There are several approaches that we can adopt in this situation. One approach, which was taken by McGeer (1990) among others, is to linearize the swing-stage equations of the robot about an equilibrium state, making it possible to explicitly integrate these equations. Next, the transition equations are concatenated and the conditions for the existence of a periodic solution of this coupled system is found. To study the stability of this periodic solution, a second linearization about the periodic solution is necessary. The problem with this approach is that the linear solution is valid only within a narrow region around the point of linearization, which is typically the stationary vertical configuration of the robot. For any real gait, and especially for higher values of the parameters, the robot significantly deviates from this point. We will show that this makes the prediction of the long-term system behavior impossible.

A second approach, adopted in the recent work of Garcia et al. (1998) and in a few studies of monopod robots (Vakakis and Burdick 1990; Ostrowski and Burdick 1993; François 1996), is to simplify the model of the robot so that some analytical insight into the simplified nonlinear model is available. For example, the point-foot walker model considered by Garcia et al. (1998) may be obtained as a special case of our more general model by setting  $\frac{m}{m_H} = \frac{1}{\mu} \rightarrow 0$  and  $\frac{a}{b} = \frac{1}{\beta} \rightarrow 0$ . Because of this simplification, the number of robot parameters is reduced from three to one (only the ground slope  $\phi$ ), which is useful for graphical visualization and analytical probing. Also it is sometimes possible to obtain an explicit expression for the Poincaré map of the robot. Although this is an attractive approach, the extension of the results to more complex models is not obvious.

In this study, we have thus decided to preserve the full nonlinear equations of the robot. The disadvantage in this

approach is that our exploration must rely to a large extent on numerical simulations. However, the computational burden is manageable, as the robot model has a relatively small state-space dimension and we can focus our study on only one leg of the robot (since the legs are identical, they will have qualitatively identical dynamics). Furthermore, our results can be used to characterize the domain of applicability of linear and simplified nonlinear models.

### 3.2. A Typical Limit Cycle

To visualize the entire dynamics of the robot over a gait cycle, it is useful to represent the dynamics by means of phase-space trajectories. In phase space, steady robot gaits are seen as stable limit cycles, and the geometric features of the cycles are characteristic of the particular gait (Goswami, Espiau, and Keramane 1997; Thuijot, Goswami, and Espiau 1997).

Figure 2 presents the sketch of a phase-space-limit cycle of a symmetric gait of the robot on a  $3^\circ$  slope. The sketch is obtained by plotting the angular position and velocity of only one leg. Thus, this is a 2-D projection of the limit cycle of the entire robot, which is in a 4-D space. For ease of comprehension, we have indicated in the figure the time instants of some of the important events during the cycle along with the corresponding stick diagrams of the robot. Let us follow the phase trajectory at the instant marked I, corresponding to time  $t = 0^+$ , when the rear leg just loses contact with the ground (i.e., it becomes the swing leg). The corresponding stick diagram shows a black dot on the front foot to imply ground contact. The phase trajectory evolves in the clockwise sense in this diagram, as shown by the arrowheads. While crossing the velocity axis (at a positive velocity), the biped is in the vertical configuration. Instant II corresponds to time  $t = T^-$ , when the swing leg is about to touch the ground. The impact between the swing foot and the ground occurs at  $t = T$ . We observe a velocity jump from II  $\rightarrow$  III due to this impact. The upper half of the cycle (I  $\rightarrow$  II) depicts the swing leg suspended as a simple pendulum from a moving point (hip). At instant III ( $t = T^+$ ), the swing leg becomes the support leg and executes the lower half of the phase-plane diagram (III  $\rightarrow$  IV). This half of the phase portrait corresponds to the motion of the support leg "hinged" at the point of support as an inverted simple pendulum. The velocity jump of the current leg (the nonsupport leg of instant I) observed between instants IV and I is due to the impact of the other leg with the ground. The cyclic trajectory is a limit cycle, and for stable gaits it attracts and absorbs all nearby trajectories that enter its attraction basin.

### 3.3. Orbital Stability of the Bipedal Gait

Since we often refer to "stability" of the bipedal gait, it is helpful to have a precise definition of the term. We consider the notion of *orbital stability* to be the most appropriate in the context of biped robot dynamics. Qualitatively speaking,

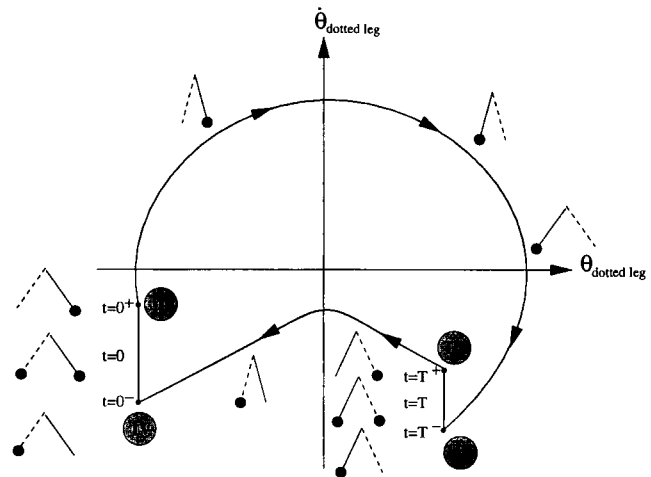


Fig. 2. A phase portrait of a symmetric walk. This figure corresponds to only one leg of the biped robot, its actual phase space being of a higher dimension. One cycle in the figure corresponds to two steps of the robot. In the figure, we have indicated some of the time stamps that are important in the dynamic evolution of the biped. On the outside of the cyclic portrait, the configuration of the biped has been shown with small stick diagrams. In these diagrams, one leg is dotted, the other leg is solid; a black dot at the foot indicates the supporting leg.

a system is orbitally stable if, starting from a steady closed-phase trajectory, any finite disturbance leads to another nearby trajectory of similar shape (Hurmuzlu and Moskowitz 1987). Adapting from Hayashi (1985), we can present this definition in a more mathematical framework. In the phase space of an autonomous system, the phase trajectory  $C$  is said to be orbitally stable if given  $\varepsilon > 0$ , there is  $\delta > 0$  such that, if  $R'$  is a representative point (on another trajectory  $C'$ ) that is within a distance  $\delta$  of  $C$  at time  $t_0$ , then  $R'$  remains within a distance  $\varepsilon$  of  $C$  for  $t \geq 0$ . If no such  $\delta$  exists,  $C$  is orbitally unstable. Analogous to the definition of asymptotic stability in the sense of Lyapunov, we may say that if the trajectory  $C$  is orbitally stable, and in addition, the distance between  $R'$  and  $C$  tends to zero as time goes to infinity, the trajectory  $C$  is asymptotically orbitally stable.

The concept of orbital stability is less common in the robotics literature. Orbital stability requires that the trajectories  $C$  and  $C'$  remain near each other, whereas Lyapunov stability of the solution  $q(t)$  requires that, in addition, the representative points  $R$  and  $R'$  (on  $C$  and  $C'$ , respectively) should remain close to each other, if they were close to each other initially. Orbital stability does not require that perturbed trajectories "remain in step."

For a general nonlinear system, the analytical demonstration of the existence of a limit cycle, its local orbital stability, and the analytical procedure to find it still remain a challenge.

However, it is possible to test the local stability of a limit cycle, once it is found. One method to determine the stability of the robot gait is through the numerical computation of its Poincaré map (McGeer 1990; Goswami, Espiau, and Keramane 1996). Limit cycles are fixed points of this map, which in the context of biped locomotion, was named the "stride function" (McGeer 1990). Essentially, the procedure consists of injecting small perturbations to the robot states around the limit cycle and calculating the eigenvalues of the sensitivity matrix. For an orbitally stable cycle, the eigenvalues lie within the unit circle; that is, their moduli are strictly less than one.

It has already been demonstrated theoretically (McGeer 1990; Garcia et al. 1998) that a passive biped robot walking on an inclined slope can exhibit stable limit cycles. A visual inspection of the gaits of the physical models constructed by McGeer (1990) appeared to have the quality of stability. Based on the results of their numerical simulations, Goswami, Espiau, and Keramane (1996) reported that a given robot appears, interestingly, to exhibit one and only one stable gait on a given slope. Depending on the values of the robot parameters  $\phi$ ,  $\beta$ , and  $\mu$ , the gait is symmetric or asymmetric. Garcia and colleagues (1998) analytically showed the existence of one stable and one unstable cycle for their point-foot walker walking on small slopes. The current paper focuses on the stable cycles only, which represent viable passive gaits.

### 3.4. Orbital Stability Implies Contraction of "Phase Fluid"

A necessary condition for the existence of a stable limit cycle can be obtained by studying the evolution of a small phase-space volume element. The complete state of a dynamic system at a certain instant is represented by a point in the phase space of the system. The effect of the perturbations on the system at this state is closely related to the behavior of the so-called phase fluid (Lanczos 1986) around that point. As the dynamic system evolves in the course of time, a small-volume element around the system state, representing the possible perturbed states, can be imagined to move around it in the phase space. An elegant mathematical treatment culminating in Liouville's theorem finds that a small-volume element<sup>1</sup> of the phase space of a Hamiltonian system behaves like an incompressible fluid. Since the Hamiltonian of a frictionless system is constant, it can be shown that the divergence of its phase fluid is zero (Hilborn 1994). In other words, the phase-space volume element may change its shape depending on the dynamics of the particular system, keeping its volume constant all along.

A dissipative system, however, does not obey Liouville's theorem, and for such systems the phase-space volume element gradually contracts as it moves. The existence of a stable limit cycle in a dynamical system is associated with

such volume contraction. This makes intuitive sense, as we know that a volume element in the attraction basin eventually converges to the limit cycle which, being a one-dimensional entity, has zero volume. The presence of dissipative elements in a system favors the existence of a stable limit cycle, but does not guarantee it in any way. However, the presence of a limit cycle in a system attests to some form of dissipation.

Since the existence of stable limit cycles for the compass-gait biped has already been demonstrated, the system must be dissipating energy. As the swing stage of the robot is a Hamiltonian system, the dissipation must come from the impact equations. The phase-space volume contraction and the strong stabilizing effect of the transition equations was pointed out by Hurmuzlu and Moskowitz (1987), and was confirmed by Goswami, Espiau, and Keramane (1996) and Garcia et al. (1998). In the following, we focus on the characteristics of the impact equations, and compute the volume contraction effected by this.

Let  $q^{*-}$  be the state vector of the robot just before the transition. We consider a parallelepiped  $\mathcal{P}^-$  based at the vertex  $q^{*-}$  (with edge vectors  $\varepsilon_j i_j$ ,  $j \in \{1, \dots, 4\}$ , with  $\varepsilon_j$  small scalars and  $i_j$  the  $j$ th column of identity matrix  $I_4$ ). We would like to calculate the change in volume of this parallelepiped (i.e., the "volume" of the ensemble of states just before collision) due to transition. When  $q^{*-}$  is perturbed by an amount  $\delta q^-$ , a first-order approximation of the state vector just after transition is

$$q^{*+} + \delta q^+ = W(\alpha^*)(q^{*-} + \delta q^-) + \left. \frac{\partial W(\alpha) q^{*-}}{\partial \alpha} \right|_{\alpha=\alpha^*} \delta \alpha. \quad (9)$$

Equation (9) can be written in a compact form as

$$\delta q^+ = W_1(q^{*-}) \delta q^-, \quad (10)$$

with

$$W_1(q^{*-}) = \begin{pmatrix} J & 0 \\ \left. \frac{\partial H(\frac{1}{2}(\theta_{ns}^+ - \theta_s^-)) \dot{\theta}^{*-}}{\partial \theta^-} \right|_{\theta^- = \theta^{*-}} & H(\alpha^*) \end{pmatrix}. \quad (11)$$

In view of equation (11), a first-order approximation to the "image" of  $\mathcal{P}^-$  through the transition matrix is the polyhedra  $\mathcal{P}^+$ , whose edge vectors starting from  $q^{*+}$  are  $\varepsilon_j w_{1,j}$ ,  $j \in \{1, \dots, 4\}$ , where  $w_{1,j}$  is the  $j$ th column of matrix  $W_1(q^{*-})$ . Since the volume of an  $n$ -dimensional parallelepiped is given by the determinant of the matrix whose columns are its  $n$ -edge vectors (Koditschek and Bühler 1991; Heckbert 1994),

1. A "hyper" volume element in higher-dimensional systems.



the volumes of  $\mathcal{P}^-$  and  $\mathcal{P}^+$  are, respectively,

$$\begin{aligned} \text{volume}(\mathcal{P}^-) &= \left| \prod_{j=1}^4 \varepsilon_j \right| \\ \text{volume}(\mathcal{P}^+) &= \left| \left( \prod_{j=1}^4 \varepsilon_j \right) \cdot \det(\mathbf{W}_1(\mathbf{q}^{*-})) \right|. \end{aligned} \quad (12)$$

Therefore, a first-order approximation to the change in phase-space volume during the transition stage of a steady gait is, using eqs. (11) and (12),

$$\frac{\text{volume}^+}{\text{volume}^-} = |\det(\mathbf{H}(\alpha^*))|. \quad (13)$$

The determinant can be computed as

$$\begin{aligned} |\det(\mathbf{H}(\alpha^*))| &= \left| \det((\mathbf{Q}^+(\alpha^*))^{-1}) \det(\mathbf{Q}^-(\alpha^*)) \right| \\ &= \frac{1}{1 + (1 + \beta)^2 [\mu + 1 - \cos^2(2\alpha^*)]}. \end{aligned} \quad (14)$$

Since  $\mu$ ,  $\beta$ , and  $1 - \cos^2(2\alpha^*)$  are always positive,  $|\det(\mathbf{H}(\alpha^*))| < 1$ , which indicates that phase-space volumes are always contracted.

It is important to recall that contraction does not imply stability. For example, the volume of a parallelepiped all of whose sides except one are contracted by a factor of two during each transition, while the last side is doubled, will vanish eventually. However the parallelepiped consists of diverging points, and will not represent a stable gait.

For a stable limit cycle, the rate of contraction describes how fast the neighboring trajectories converge. For the robot model with  $\mu = 2$ ,  $\beta = 1$ , and  $\alpha^* = 15^\circ$ , we get  $\det(\mathbf{H}(\alpha^*)) = 0.1$ . Thus, we can say that locally, the phase-space volumes are contracted by a factor of 10, indicating that the limit cycle is strongly attractive.

Finally, let us present two graphical visualizations showing the effect of  $\mathbf{H}(\alpha)$  as a mapping between the pre-impact and post-impact joint velocities. In Figure 3, we show this mapping in the three-dimensional space of joint velocities  $\dot{\theta}_s$ ,  $\dot{\theta}_{ns}$ , and the interleg angle  $2\alpha$ . The wire frame parallelepiped region shown in the figure represents the ensemble of pre-impact robot states with both joint velocities varying from  $-100^\circ/\text{sec}$  to  $+100^\circ/\text{sec}$ , and the interleg angle varying from  $0^\circ$  to  $80^\circ$ . We took horizontal (constant interleg angle) slices of this parallelepiped and mapped them through  $\mathbf{H}(\alpha)$ . The mapped quadrilateral regions were stacked one above another, and the stack was superposed on the pre-impact parallelepiped for direct comparison. By comparing the size of a cross-section of the parallelepiped and the size of any of the mapped quadrilaterals in the figure, we can clearly see the contraction of the space. Also the figure shows the twist produced in the space by the mapping.

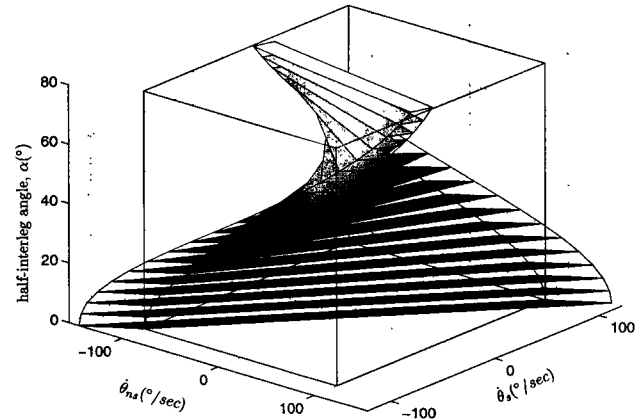


Fig. 3. The characteristics of the mapping through the matrix  $\mathbf{H}(\alpha)$ , demonstrated graphically. The wire-frame parallelepiped represents an ensemble of pre-impact robot states (joint velocities  $\dot{\theta}_s^-$ ,  $\dot{\theta}_{ns}^+$ , and interleg angle  $2\alpha$ ). We have taken horizontal (constant interleg angle) slices of this parallelepiped and mapped these square regions through  $\mathbf{H}(\alpha)$  to obtain quadrilateral regions of post-impact robot states  $\dot{\theta}_s^+$ ,  $\dot{\theta}_{ns}^+$ . The quadrilaterals at their respective horizontal positions (their  $2\alpha$  values) were then stacked one above another and the entire stack was superposed on the pre-impact parallelepiped for direct comparison of their sizes. The corresponding vertices of the quadrilaterals for each horizontal position are connected by a line (four lines for four vertices) to show the twist produced by the mapping. A pre-impact square cross section is mapped to a post-impact quadrilateral of much smaller area, illustrating the phase-fluid contraction.

Another way to investigate the behavior of the matrix  $\mathbf{H}(\alpha)$  is to observe the evolution of its eigenvalues as the robot parameters continuously change. In Figure 4a, we show the moduli of the two eigenvalues of  $\mathbf{H}(\alpha)$  as functions of the interleg angle  $2\alpha$  (varying from  $0^\circ$  to  $80^\circ$ ) and  $\beta$  (varying from 0.8 to 10). Figure 4b is identical to Figure 4a, except that here  $2\alpha$  and  $\mu$  are the variables, with  $\mu$  varying between 0.3 to 10. In both of the figures, a typical curve has three separate zones. In the first zone, corresponding to small values  $2\alpha$ , the eigenvalues are real and distinct and their evolution with respect to  $2\alpha$  is given by two separate lines. As the eigenvalues become complex conjugates, these two lines merge and begin the second zone. At the end of the second zone, the lines separate out, reflecting that the eigenvalues have again become real and distinct. This is the third zone. The relative sizes of the zones depend on the parameters  $\mu$  and  $\beta$ .

Recalling that the determinant of a matrix is equal to the product of its eigenvalues, we can immediately notice the phase-fluid contraction caused by  $\mathbf{H}(\alpha)$  by reading from the plots the moduli of the two eigenvalues for any given  $2\alpha$ . One curious thing happens for small values of  $\beta$ ; as the value of  $\alpha$

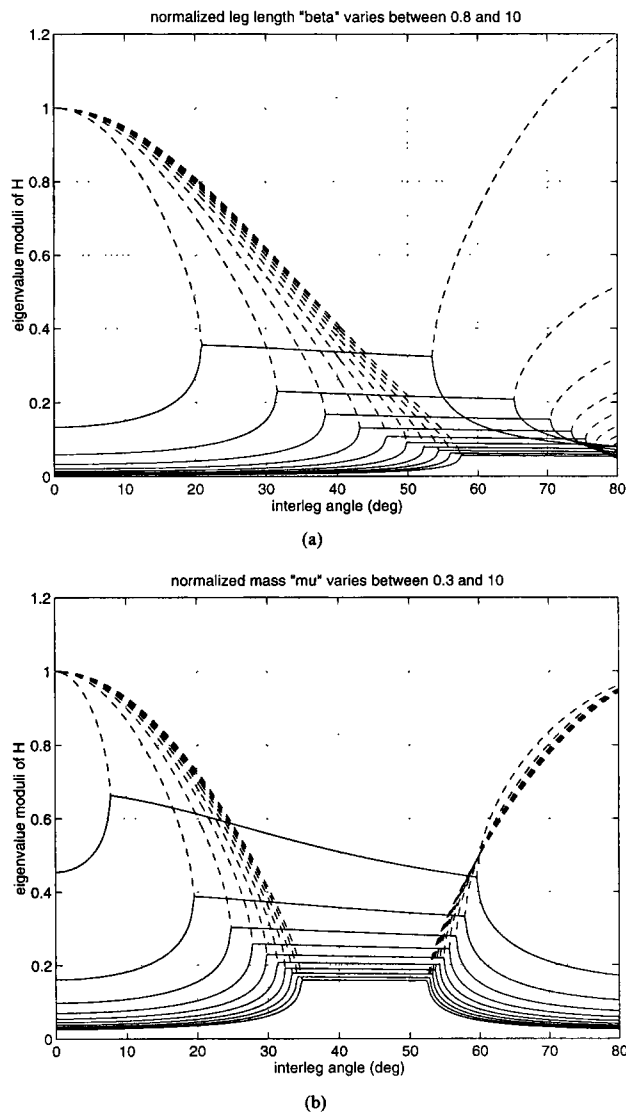


Fig. 4. The moduli of the eigenvalues of the transition matrix  $H(\alpha)$  are shown as functions of the parameters  $\beta$  (a) and  $\mu$  (b). In both the figures, the vertical axis represents the eigenvalue moduli, and the horizontal axis is the interleg angle  $2\alpha$ . The volume contraction of phase fluid is proportional to the determinant of  $H(\alpha)$ , which is equal to the product of its two eigenvalues. For any  $2\alpha$ , we can visually infer the contraction by reading the moduli of the two eigenvalues from the plots.

is increased, the modulus of the larger of the two eigenvalues increases rapidly. When  $\beta = 0.8$  and  $2\alpha = 80$ , the larger eigenvalue modulus reaches 1.2, and continues to increase if we go on decreasing  $\beta$ ; for instance, when  $\beta = 0.01$  and  $2\alpha = 80$ , it reaches 97.69. However, the determinant of the matrix is always less than unity, thereby guaranteeing volume contraction.

#### 4. The Influence of Robot Parameters on the Gait

This section presents the effects of continuous change of the parameters  $\phi$ ,  $\mu$ , and  $\beta$  on the gait of our compass-like biped robot. First, we discuss the limitations of a linear model in predicting the robot's long-term behavior. Next, we point out the general features of the symmetric gaits of the robot—this section mainly consists of a graphical presentation. When one of the parameters exceeds a certain limiting value, we observe bifurcation of the dynamics, which we discuss subsequently. Finally, we focus on the features of chaotic behavior of the robot gait, and calculate the fractal dimension of the strange attractor to which the phase-space trajectory collapses. Since, to our knowledge, there is no analytical method of studying the long-term global behavior of such full-fledged nonlinear and hybrid systems, we adopt numerical techniques for this purpose.

Let us provide certain specifications for the numerical tools that we use. All the simulations presented in this article have been performed using the software Scilab 2.2 developed by INRIA (1997). We have used the routine `ode`, the initial-value problem solver with a dedicated stopping-time algorithm. In the background, `ode` uses the routine `lsodar`, the well-known Livermore solver for ordinary differential equations, with automatic method switching for stiff and nonstiff problems, and with root finding. The algorithm is guided by two error-threshold parameters called `rtol` and `atol`, the relative and absolute estimated error parameters, respectively. The estimated error in each state is bounded by  $\text{rtol} \times \text{abs}(\text{state\_variable}(i)) + 0.01 \times \text{atol}$ . For our simulations, we set  $\text{rtol} = 1.d-5$  and  $\text{atol} = 1.d-7$ . The particular advantage of this algorithm is that the user is not required to determine if the problem is stiff or nonstiff, as the algorithm decides it automatically and switches to the correct mode. The arithmetic precision of the algorithm is  $1.d-18$ .

The stopping-time algorithm plays an important role in our simulation. It is employed to precisely detect the contact of the swing leg with the ground. The algorithm is a nonlinear root finder that finds only those roots for which some function, which in our case is the distance between the robot leg and the ground, changes sign in the interval of integration. When a root is found, it is located only to within an error of  $\text{hmin} = 100 \times \text{uround} \times \max(\text{abs}(x_0), \text{abs}(x_1))$ , where `uround` is the unit roundoff of the machine, and  $x_0$  and  $x_1$  are the endpoints of the interval where roots are sought.

The contact between the robot and the ground is detected with a typical precision of  $1 \cdot 10^{-17}$  m.

#### 4.1. Limitations of the Linear Model

One of the most important pieces of information necessary for such numerical techniques is the size of the basin of attraction of the stable limit cycle. If the initial states of the robot are within the basin of attraction, they will eventually converge to the limit cycle. To guess such initial conditions, we have tried using the initial states calculated from the analytical solution of the linearized robot model (Goswami, Thuijot, and Espiau 1996). Similar to the method proposed by McGeer (1990), we linearized the swing-stage equations around the equilibrium  $q = 0$ , which represents a motionless vertical configuration of the robot. The transition equations were added and a periodicity condition of the gait was employed to analytically obtain initial states that lie precisely on a periodic solution of the linear model.

If nonlinearities in the equations are not too influential, these initial states will perhaps belong to the attraction basin of the limit cycle of the actual nonlinear model, and the solution will eventually converge to it after the transients die down. Our simulations showed that this approach is successful for small  $\phi$  and small  $\beta$ . Specifically, for any  $\mu \in [0.1, 10]$ , this method leads us to a limit cycle

for  $\beta < 4.8$  when  $\phi = 0.25^\circ$ , for  $\beta < 1.5$  when  $\phi = 3^\circ$ ,  
for  $\beta < 2.9$  when  $\phi = 1.5^\circ$ , for  $\beta < 1$  when  $\phi = 4^\circ$ .

Interestingly enough,  $\mu$  does not affect the success or failure of this method.

In situations where prediction based on the linear model failed, we chose as the initial states a state vector  $q$  on the known nonlinear limit cycle of a robot whose parameters ( $\phi$ ,  $\mu$ ,  $\beta$ ) were close to those of the robot under study. Given the relatively small dimension of the state space, this method worked satisfactorily.

#### 4.2. Symmetric Gaits

This section is an album of plots (Figs. 5, 6, and 7) presenting the evolution of pertinent *gait descriptors* as functions of the three parameters during the symmetric gait regime of the robot. As opposed to a parameter that can be directly altered, a gait descriptor is an observed (measurable or computable) quantity that cannot be modified directly, but is indirectly influenced by the parameters. The gait descriptors that appear the most meaningful to us for this study are the state variables  $q$ , the half-interleg angle at touchdown  $\alpha$ , the step period  $T$ , the average speed of progression  $v$ , the total mechanical energy of the robot  $E$ , and the loss of mechanical energy  $\Delta E$  due to impact.

The evolution of the gait descriptors is presented in the form of so-called bifurcation diagrams (Guckenheimer and

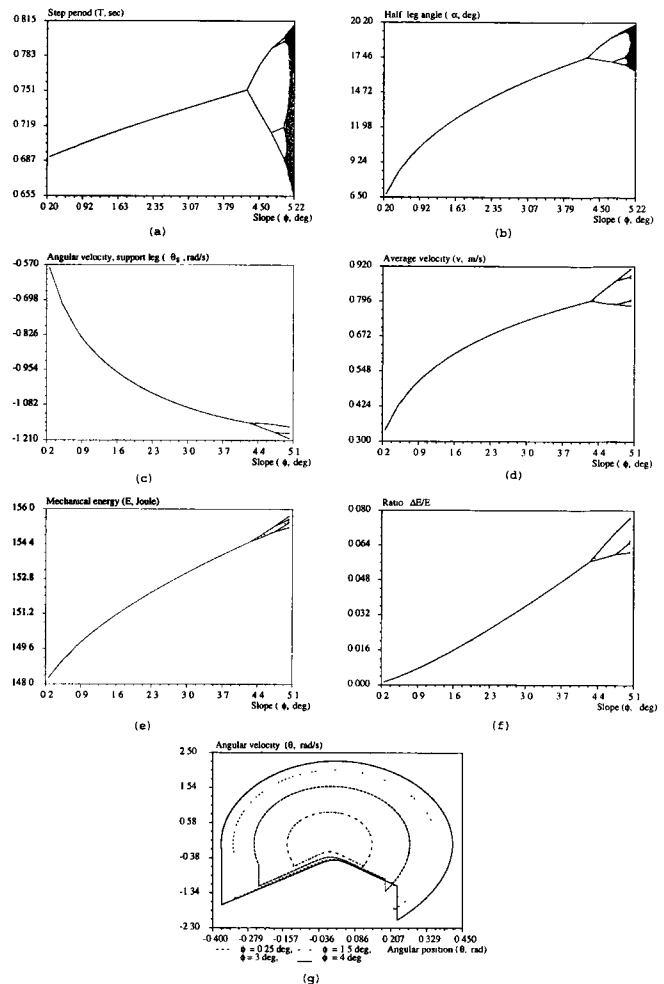


Fig. 5. Bifurcation diagrams showing the variation of the gait descriptors, with respect to ground slope  $\phi$ : (a) step period  $T$ ; (b) half-interleg angle  $\alpha$ ; (c) angular velocity of the support leg  $\dot{\theta}_s$ ; (d) average speed of progression  $v$ ; (e) mechanical energy  $E$ ; (f) ratio  $\frac{\Delta E}{E}$ ; (g) phase-plane limit cycles for  $\phi = 0.25^\circ$ ,  $1.5^\circ$ ,  $3^\circ$ , and  $4^\circ$ .

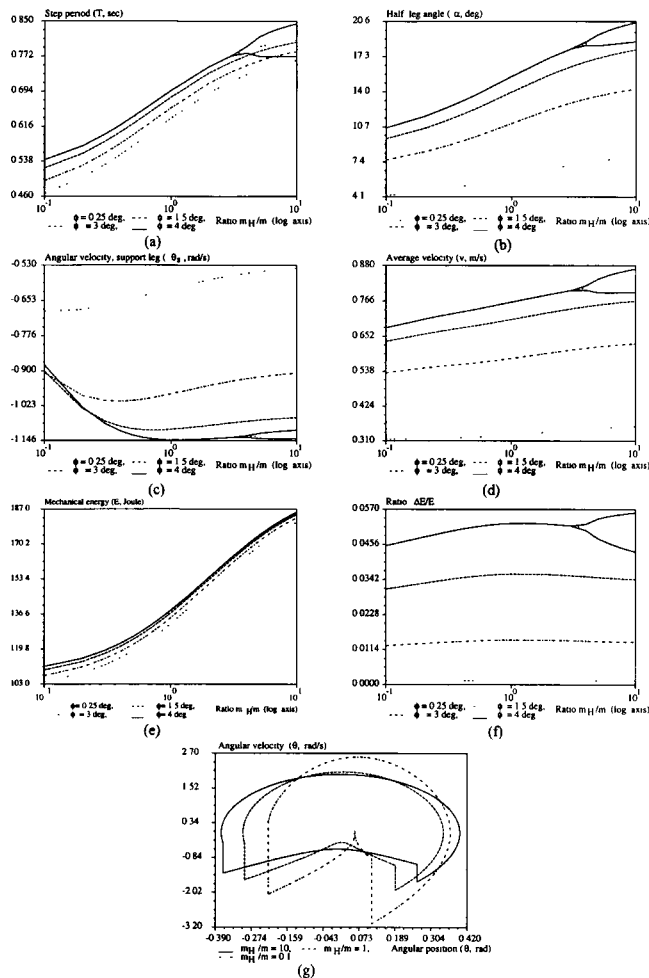


Fig. 6. Bifurcation diagrams showing the variation of the gait descriptors with respect to mass ratio  $\mu$ : (a) step period  $T$ ; (b) half-interleg angle  $\alpha$ ; (c) angular velocity of the support leg  $\dot{\theta}_s$ ; (d) average speed of progression  $v$ ; (e) mechanical energy  $E$ ; (f) ratio  $\frac{\Delta E}{E}$ ; (g) phase-plane limit cycles for  $\mu = 10, 1$ , and  $0.1$  ( $\beta = 1, \phi = 3^\circ$ ). For (a) through (f),  $\beta = 1, \phi = 0.25^\circ, 1.5^\circ, 3^\circ$ , and  $4^\circ$ .

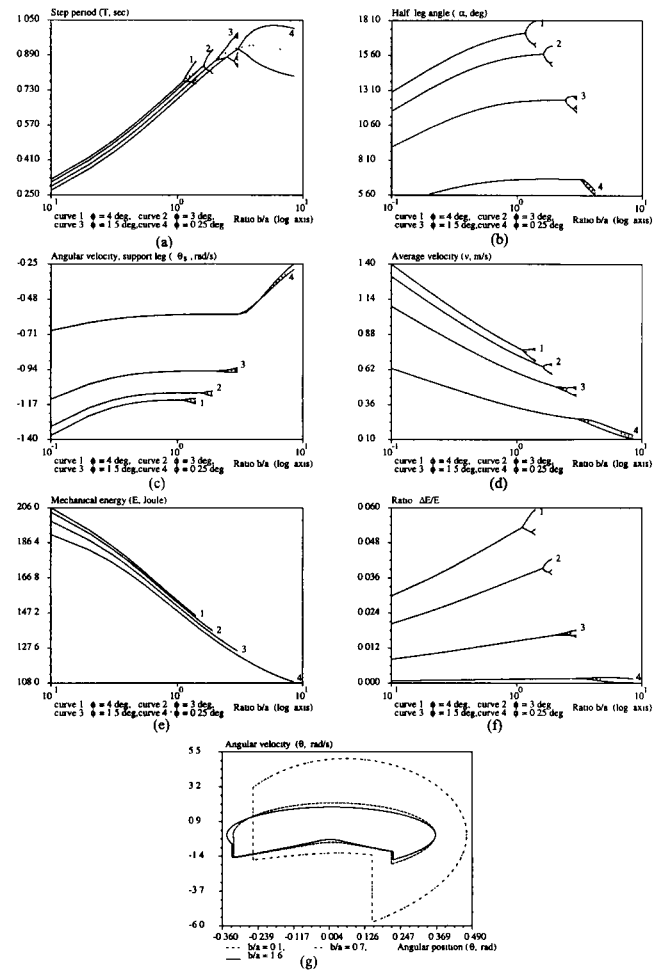


Fig. 7. Bifurcation diagrams showing the variation of the gait descriptors with respect to the length ratio  $\beta$ : (a) step period  $T$ ; (b) half-interleg angle  $\alpha$ ; (c) angular velocity of the support leg  $\dot{\theta}_s$ ; (d) average speed of progression  $v$ ; (e) mechanical energy  $E$ ; (f) ratio  $\frac{\Delta E}{E}$ ; (g) phase-plane limit cycles for  $\beta = 0.1, 0.7$ , and  $1.6$  ( $\mu = 2, \phi = 3^\circ$ ). For (a) through (f),  $\beta = 1, \phi = 0.25^\circ, 1.5^\circ, 3^\circ$ , and  $4^\circ$ .



Holmes 1983; Bergé, Pomeau, and Vidal 1984; Hilborn 1994).<sup>2</sup> Figures 5a–5f, 6a–6f, and 7a–7f present the evolution of the gait descriptors  $T$ ,  $\alpha$ ,  $\dot{\theta}_s$  (at the beginning of a step),  $v$ ,  $E$ , and  $\frac{\Delta E}{E}$  as functions, respectively, of the parameters  $\phi$ ,  $\mu$ , and  $\beta$ . The results show that both the step period and the step length of the robot increase with an increase in any of the three parameters. The robot's translational velocity, however, increases with  $\phi$  and  $\mu$ , but decreases with  $\beta$ . The overall behavior of the robot can be summarized qualitatively as follows:

	$T$	$L$	$E$	$v$
When $\phi \nearrow$	$\nearrow$	$\nearrow$	$\nearrow$	$\nearrow$
When $\mu \nearrow$	$\nearrow$	$\nearrow$	$\nearrow$	$\nearrow$
When $\beta \nearrow$	$\nearrow$	$\nearrow$	$\searrow$	$\searrow$

Some interpretations are in order here. Let us consider the evolution of total mechanical energy  $E$  of the robot in response to parameter changes. As the ground slope  $\phi$  increases, the potential energy  $PE$  of the robot that is available per step slightly increases. The kinetic energy  $KE$ , being roughly proportional to  $\|\dot{\theta}\|^2$ , also increases; see Figure 5c. As a consequence, the total energy  $E$  increases, as shown in Figure 5e. An increase in  $\beta$ , however, causes a net decrease in  $E$ —see Figure 7e—and can be explained as follows. An increase in  $\beta$  results in a lowering of the center of mass of the robot, which lowers  $PE$  available per step and increases the step period. The latter results in a decrease in the average velocity of the robot (Fig. 7d). The increase in  $KE$  caused by the small increase in  $\dot{\theta}_s$  cannot compensate for the decrease in  $PE$ , and consequently lowers  $E$ . Conversely, an increase in  $\mu$ , which results in raising the center of mass of the robot, increases  $E$ .

It is interesting to look at the effect of a parameter change on the evolution of entire limit cycles, as shown in Figures 5g, 6g, and 7g. In response to an increase in  $\phi$ , the limit cycle expands along both the axes (see Fig. 5g), implying an increase in the range of joint angle and joint velocity. The limit cycles are compressed along the joint-velocity axis for an increase in the parameters  $\mu$  and  $\beta$  (Figs. 6g and 7g). A shorter reach of the limit cycle along the joint-velocity axis means a smaller maximum-joint velocity, but does not necessarily mean a slower robot. We see in Figure 6d that an increase in  $\mu$  is associated with an increase in the average speed of progression  $v$ .

It is also interesting to note that for a given triplet  $(\phi, \mu, \beta)$ , we have never identified more than one stable steady gait. Moreover, except in Figures 6c and 6f, all the gait descriptors evolve monotonically in the symmetric gait regime. This reinforces our suspicion that for a given robot with specified

parameters  $\mu$  and  $\beta$ , the ground slope  $\phi$  uniquely defines all gait variables. Although we cannot claim this as a proof, the property of monotonic evolution of the variables is nevertheless exploited by Goswami, Espiau, and Keramane (Espiau and Goswami 1994; Goswami, Espiau, and Keramane 1996, 1997) in formulating control strategies for the compass. It was observed that a scalar control law that seeks to converge the mechanical energy of the “actively controlled” compass to that corresponding to a known passive gait ensures, in fact, the convergence of *all* the state variables of the robot.

For our nominal robot model, we have found symmetric gaits until  $\phi = 4.37^\circ$ , at which point the gait bifurcates to a two-period gait. The model studied by Garcia et al. (1998) exhibited symmetric gaits until  $\phi = 0.865^\circ$ .

### 4.3. Period-Doubling Bifurcation

We noticed in Figures 5 and 6 that for the range of variations of the parameters considered in this study, an increase in  $\phi$  and  $\beta$  cause a bifurcation in all the gait descriptors. Bifurcation was also observed for higher values of  $\mu$ , especially when coupled with higher values of  $\phi$  (Fig. 7).

The occurrence of period-doubling bifurcation can be studied by means of the Poincaré first-return map (Bergé, Pomeau, and Vidal 1984; Hilborn 1994) constructed in the neighborhood of a stable limit cycle. The eigenvalues of the Jacobian matrix of this map are indicators of the bifurcation. For a stable symmetric gait, the eigenvalues are within the unit circle. Modification of a parameter alters the eigenvalues, and at the bifurcation point, at least one crosses the unit circle. Recalling that the unit-circle crossing of the eigenvalues is also an indication of instability in the symmetric gait, we may say that at the bifurcation point the symmetric gait becomes unstable. In fact, the eigenvalues of the first return map of the stable post-bifurcation gait, which correspond to those of the “second” return map of the pre-bifurcation symmetric gait, will remain inside the unit circle.

The particular fashion in which an eigenvalue crosses the unit circle determines the type of structural instability that the system undergoes. Flip bifurcation (Troger and Steindl 1991), which is the case here, corresponds to an eigenvalue leaving the unit circle along the real axis, with a negative real part. Figure 8 presents the evolution of the eigenvalues of the Jacobian of the biped's Poincaré map as a function of  $\phi$ . All are real, and one of them actually reaches the value  $-1$  when the first bifurcation point is reached at  $\phi = 4.37^\circ$ .

As a consequence of the period-doubling bifurcation, the limit cycle becomes two-periodic and the robot gait becomes asymmetric with a shorter step and a longer step. The occurrence of bifurcation is shown in Figures 5, 6, and 7 by the emergence of two branches in the curves, each associated with one of the two dissimilar steps and describing its characteristic variables. Since bifurcation involves the state of the system and since all the gait descriptors, in turn, depend on the

2. Discussion of bifurcation and asymmetric gaits, represented by the regions beyond the branched sections in the bifurcation diagrams of Figures 5, 6, and 7, is postponed until the next section.

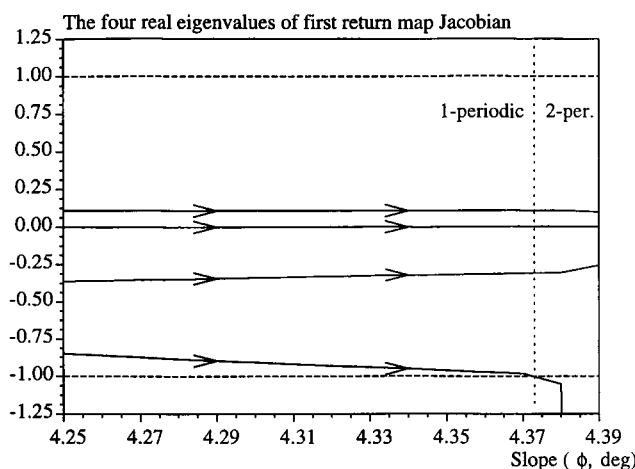


Fig. 8. Transition from a one-period to a two-period steady gait: behavior of the eigenvalues of the Jacobian matrix of the robot's Poincaré map.

robot states, the occurrence of bifurcation is simultaneously manifested in all the gait descriptors.<sup>3</sup>

On further increasing the parameters, the robot gait may experience further period doubling, giving rise to a four-period limit cycle. This phenomenon, repeated ad infinitum, is called a *period-doubling cascade*, and is recognized as one of the possible routes leading to chaos. Regardless of the parameter considered, we observe that the successive period doublings occur after progressively smaller intervals of parameter variation. This is expected in view of general results on period-doubling cascades (Bergé, Pomeau, and Vidal 1984).

Period-doubling cascades leading to chaotic behavior have already been observed for passive, planar, hopping robots that possess a smaller dimension than that of the compass. "Limping gaits" (the term given to  $2^n$ -period gaits) were observed and analyzed for hopping robots (Raibert 1986; Vakakis and Burdick 1990; Koditschek and Bühler 1991; McCloskey and Burdick 1991; Ostrowski and Burdick 1993; François 1996).

In Figure 9, we introduce a novel way of capturing the behavior of the biped during a period-doubling cascade ensuing from the parameter  $\phi$  (other parameters are kept constant at  $\mu = 2$ ,  $\beta = 1$ ). The figure plots the first return map of  $\theta_{ns}$ . For a one-period robot gait,  $\theta_{ns}$  is the same in every step. This gait is therefore represented by a point on the  $45^\circ$  line. As we change the ground slope, this point moves along the  $45^\circ$  line from the right-hand top corner of Figure 9, as indicated by the arrow.

The first-period doubling occurs at  $\phi = 4.37^\circ$  when the gait turns two-periodic, and is therefore represented by two points. Just after the first bifurcation, the two representative

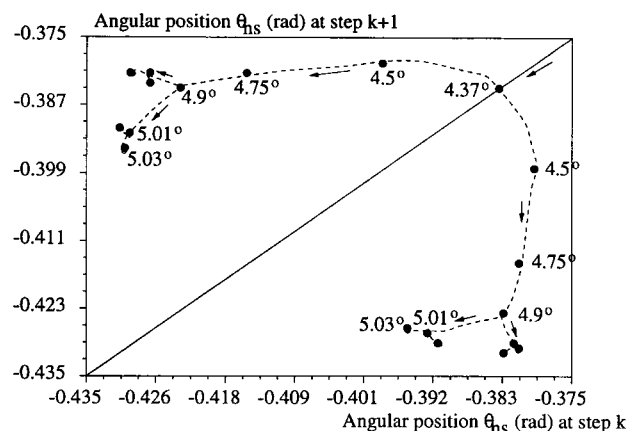


Fig. 9. First-return map of  $2^n$ -period steady gaits, where  $n \in \{0, 1, 2, 3\}$ . In response to a variation of the ground slope from  $\phi = 4.37^\circ$  to  $5.03^\circ$ , the robot gait undergoes three successive bifurcations. Here we show the Poincaré map of the nonsupport leg angle  $\theta_{ns}$ . Until the first bifurcation occurs at  $4.37^\circ$ , the map is a point on the  $45^\circ$  line.

points differ only slightly from that of the one-period gait from which they originate. The two steps are therefore very similar to the steps of the symmetric gait. On further changes in the parameter, the two representative points move away from the  $45^\circ$  line along the two branches shown by dotted lines in Figure 9. It follows that one step length is slightly longer and the other is slightly shorter than those of the corresponding symmetric gait. As we increase the slope, the longer step is further elongated and the shorter step is further shortened.

This continues until a second period doubling occurs at  $\phi = 4.9^\circ$ , when each branch gives rise to two subbranches. In this four-period gait, the four different steps are visited in the same order with a long step always followed by a short step. The last clearly identifiable bifurcation occurs when  $\phi = 5.01^\circ$ , as the robot gait becomes eight-periodic.

The period-doubling cascade may also be observed using phase-plane diagrams. The phase-plane diagram for a symmetric gait is shown in Figure 2, which is a single-loop closed trajectory repeated after two robot steps. During one step, the considered leg is in the swing stage, and during the following step, it is in the support stage. Since the gait is symmetric, the robot legs are indistinguishable and the phase-plane cycles of the two legs are identical.

In the case of a two-period gait, since all state variables are identical after every two steps, the phase-plane limit cycle associated with one leg is still a single-loop closed trajectory repeated after two robot steps (see Fig. 10a). However, since the gait is asymmetric, the limit cycles associated with the legs are no longer identical.

In the case of  $2^n$ -period gaits, all the state variables repeat themselves after every  $2^n$  steps. The phase-plane diagram as-

3. The occurrence of bifurcation may not, however, be equally prominent in all the bifurcation diagrams, because of the effect of scaling. Thus, whereas we can clearly see a bifurcation of the step period in Figure 5a, the corresponding bifurcation of the mechanical energy is much less prominent in Figure 5e.

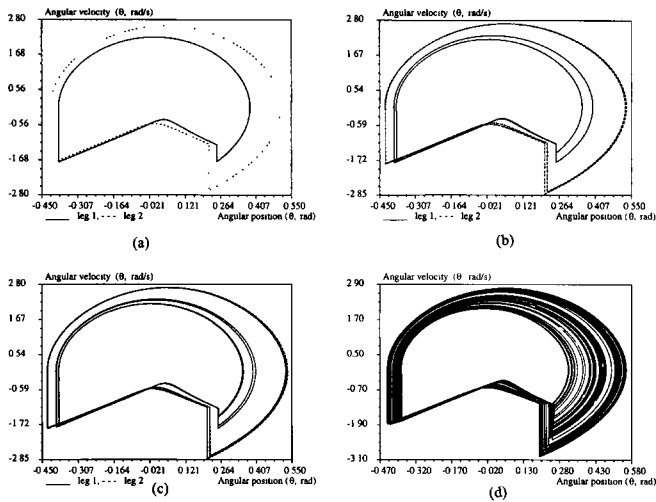


Fig. 10. Phase-plane limit cycles: (a) a two-period steady gait ( $\phi = 4.75^\circ$ ); (b) a four-period steady gait ( $\phi = 5^\circ$ ); (c) an eight-period steady gait ( $\phi = 5.02^\circ$ ); and (d) a chaotic gait associated with one leg, in 100 robot steps ( $\phi = 5.2^\circ$ ). For all four plots,  $\mu = 2$  and  $\beta = 1$ .

sociated with one leg is therefore a  $2^{n-1}$ -loop closed trajectory repeated every  $2^n$  steps, distinguishable from the phase-plane diagram of the other leg. A visual inspection of the phase-plane diagrams of the four-period and the eight-period gaits (Figs. 10b and 10c) correctly indicates that they result from the bifurcation of the preceding two-period and four-period gaits, respectively.

#### 4.4. Chaotic Gaits

The chaotic gait is an extreme case of the asymmetric gait, and is characterized by a complete disappearance of gait order. During a chaotic gait on a given slope, the states, and consequently the gait descriptors, of the biped robot never completely repeat themselves. Chaotic gaits are represented in the bifurcation diagrams by a continuous distribution of points. We explicitly show them in Figures 5a and 5b, and omit them in the other bifurcation diagrams for the sake of clarity.

For our compass-gait robot, the eight-period gait is exhibited until  $\phi = 5.03^\circ$ . If  $\phi$  is further increased, several period doublings take place very quickly; starting from  $\phi = 5.04^\circ$ , we are unable to detect any periodicity in the motion of the robot. What we mean becomes clearer from Figure 11a, which shows 50 consecutive step periods. Although none of these periods are exactly equal, a histogram, that is, the frequency of occurrence of a small range of step periods versus the range, reveals four major clusters; see Figure 11b. This indicates the remnants of some order in the system.

Beyond  $\phi = 5.04^\circ$ , all indicators of order continue to disappear. Figure 11c shows the step periods for 50 consecutive

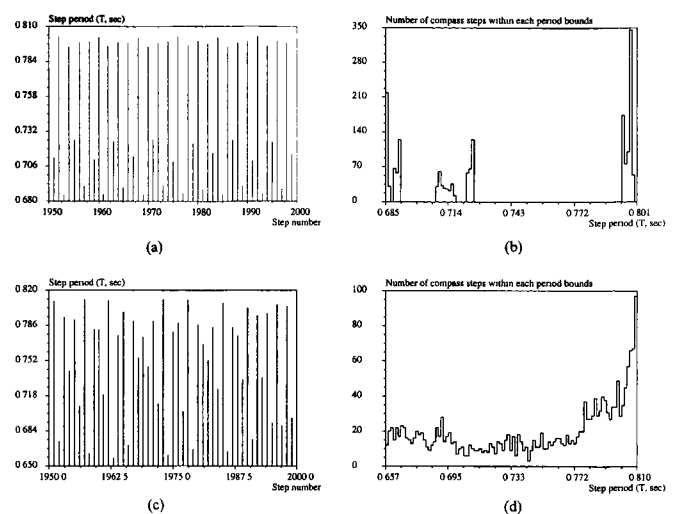


Fig. 11. The top two plots illustrate the  $2^n$ -period steady gait, where  $n$  large: (a) periods of 50 consecutive steps; and (b) a histogram of the periods of 2,000 consecutive steps for  $\phi = 5.04^\circ$ . The bottom two plots show the chaotic gait: (c) periods of 50 consecutive steps; and (d) a histogram of the periods of 2,000 consecutive steps for  $\phi = 5.2^\circ$ . For all four plots,  $\mu = 2$  and  $\beta = 1$ .

steps, and Figure 11d shows a frequency histogram of 2,000 steps for  $\phi = 5.2^\circ$ , which is the steepest slope for which the nominal model showed a steady gait. No order in any of the gait descriptors can be detected at this slope. The latter figure shows the presence of “broad-band frequency,” a key feature of chaos. Figure 10d shows the associated phase-plane diagram. The robot does not exhibit limit-cycle behavior anymore, but the trajectories stay on a strange attractor, which is a manifold of a lower dimension in the phase space.

Following Garcia et al. (1998), we show a Poincaré section of the strange attractor in Figure 12. The hyperplane in the phase space on which the points of repeated crossings of the phase trajectory forms the Poincaré map is described by  $\theta_s = -2\phi - \theta_{ns}$ . Physically, this hyperplane corresponds to the beginning of the swing stage. Strange attractors of dynamic systems are generally known to possess a *fractal* or noninteger dimension. We can observe that the Poincaré section consists of multiple closed packed lines separated by empty spaces. The attractor is therefore neither a line nor a surface, and should have a dimension between one and two.

A numerical procedure (Bergé, Pomeau, and Vidal 1984) was employed to compute the fractal (Hausdorff-Besicovitch) dimension of the strange attractor<sup>4</sup> whose Poincaré section is depicted in Figure 12. For the robot with a four-dimensional state space, the fractal dimension of the strange attractor was found to be 2.07. The attractor is thus dimensionally close to

4. The fractal dimension calculated by this numerical algorithm provides a lower bound for the Hausdorff-Besicovitch dimension. It is an approximate, but close, estimation of it.

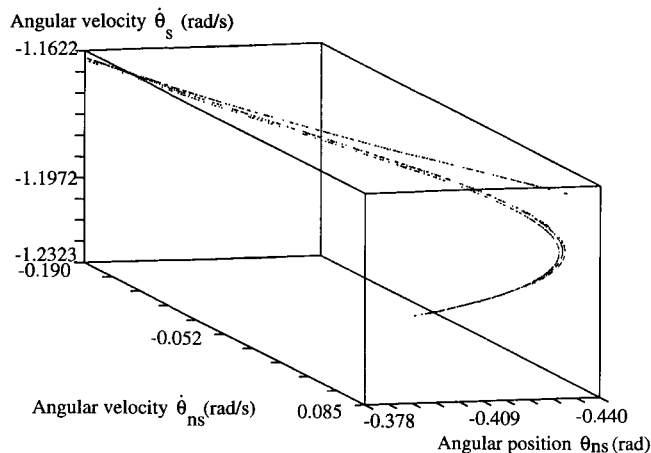


Fig. 12. The 3-D Poincaré section of the chaotic gait. This section was taken along  $\theta_{ns} + \theta_s = -2\phi$ , that is, at the beginning of a swing stage (where  $\phi = 5.2^\circ$ ,  $\mu = 2$ , and  $\beta = 1$ ).

a Euclidean plane. This is a consequence of the strong phase-space volume contraction, which is discussed in Section 3.4.

The gradual progression of the robot gait to the chaotic regime is well depicted in the first return maps of  $\theta_{ns,k+1} = f(\theta_{ns,k})$ , shown in Figure 13. When  $\phi = 5.03^\circ$ , the gait is eight-periodic, and its first return map consists of eight points (as was shown in Fig. 13a). At  $\phi = 5.04^\circ$ , the first return map still consists of eight distinguishable clusters of points (Fig. 13a). Through multiple period-doubling bifurcations, this eight-period gait gives rise to a  $2^n$ -period gait with a large  $n$ . This gait still preserves some similarity with the eight-period gait from which it originates. For example, step order is still preserved, and  $\theta_{ns}$  always visits the eight clusters, as shown in Figure 13a, in the same order. In this order, a large  $\theta_{ns}$  (i.e.,  $|\theta_{ns}| > .4$  rad) is always followed by a small  $\theta_{ns}$  (i.e.,  $|\theta_{ns}| < .4$  rad).

When  $\phi = 5.08^\circ$ , the eight clusters of points merge into two larger packs; see Figure 13b. Some order is still preserved, since a large  $\theta_{ns}$  is still always followed by a small one. The same property continues to hold for  $\phi = 5.12^\circ$ , but in this case the first return map appears as a continuum of points (Fig. 13c). We are therefore very close to the broad-band frequency characteristic typical of chaotic behavior. Finally, when  $\phi = 5.2^\circ$ , we observe that predictability and periodicity have been completely destroyed, since a large  $\theta_{ns}$  can be followed by another large one. The layered structure of the strange attractor can also be guessed from the first return map.

It is extremely interesting to note that the first return maps of all of the robot-gait descriptors look remarkably similar. For instance, the first return map of the step period  $T$  (Fig. 14) looks like a scaled and rotated first return map of  $\theta_{ns}$  (Fig. 13d). With this we can suggest that all of the characteristics of the passive chaotic gait of our robot are somehow

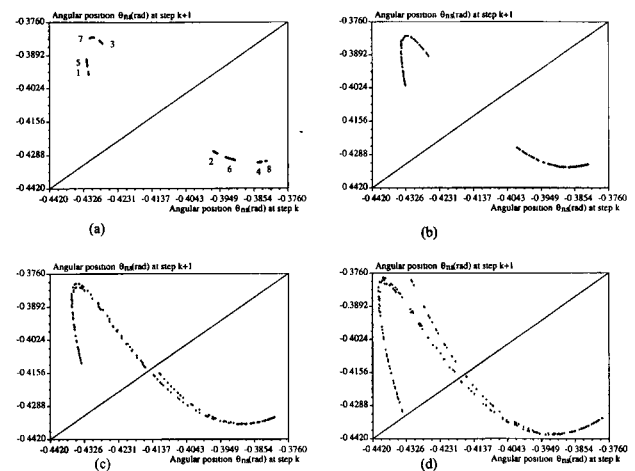


Fig. 13. The first return map of  $\theta_{ns}$ : (a) the  $2^n$ -period gait, where  $n$  is large ( $\phi = 5.04^\circ$ ); (b)  $2^n$ -period gait, where  $n$  is very large ( $\phi = 5.08^\circ$ ); (c) the approaching chaotic gait ( $\phi = 5.12^\circ$ ); and (d) the chaotic gait ( $\phi = 5.2^\circ$ ). For all four plots,  $\mu = 2$  and  $\beta = 1$ .

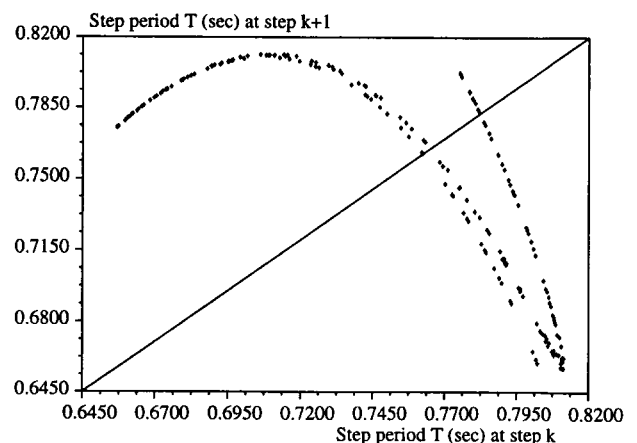


Fig. 14. The first return map of  $T$ : a steady chaotic gait where  $\phi = 5.2^\circ$ ,  $\mu = 2$ , and  $\beta = 1$ .

ensconced in the shape of its first return map, which can be viewed as a signature of the chaotic gait.

An important characteristic of chaotic motion is the exponential divergence of nearby trajectories (Hilborn 1994). The phase-space trajectories of our biped robot exhibit this behavior, and this section ends with a presentation of this fact. Figures 15a and 15b show the divergence of trajectories initiating from nearby phase-space points and continuing for 2 and 12 steps, respectively. The initial states of the two trajectories are

$$\mathbf{q} = \begin{bmatrix} -0.3829 & 0.2039 & -0.1635 & -1.1622 \end{bmatrix}^T,$$

corresponding to the dashed line, and

$$\mathbf{q} = \begin{bmatrix} -0.3819 & 0.2039 & -0.1635 & -1.1622 \end{bmatrix}^T,$$



corresponding to the solid line. After just 2 steps, the difference in the trajectories is clearly identifiable; after 12 steps, the trajectories bear no semblance to each other although they lie on the same attractor.

## 5. Dampers Improve Gait Stability

Taking a cue from the connection between gait stability and energy dissipation, we studied the effect of placing passive damping elements in the robot's hip joint. A significant improvement of the gait stability and overall gait versatility was achieved by this without violating the "passive" status of the robot. The damper affects a continuous dissipation of energy in the robot in addition to the energy dissipated intermittently during ground impact. Although even a linear damper may increase the range of slopes on which steady gaits exist, we obtained more encouraging results with quadratic dampers. It is possible to consider the damper coefficient as another parameter affecting the robot gait; however, we give it a special status here because of its obvious connection to control laws. Indeed, the passive quadratic damper placed in the robot's hip joint can be easily replaced by a motor implementing the same physical law. The damper generates a hip-joint torque  $u_H \propto -\dot{\theta}_H^2 \text{sign}(\dot{\theta}_H) = -(\dot{\theta}_{ns} - \dot{\theta}_s)^2 \text{sign}(\dot{\theta}_{ns} - \dot{\theta}_s)$ .

The presence of a damper profoundly alters the passive gait of the robot on a given slope.<sup>5</sup> In Figure 16 we show three different limit cycles of the robot on a 4° slope—one for the damperless gait (the solid line) and the other two corresponding to two different quadratic dampers (the dashed line for 0.08 Nm/(rad/sec)<sup>2</sup>, and the innermost dotted-line cycle for 0.15 Nm/(rad/sec)<sup>2</sup>).

A robot equipped with a damper may exhibit steady gaits for a larger range of slopes. Fig 17 shows the steady stable gait (asymmetric) for a 10° slope obtained with a quadratic hip damper with a coefficient of 0.23 Nm/(rad/sec)<sup>2</sup>. For a damperless robot, no gait cycle was found beyond a 5.2° slope.

Figure 18 plots the robot's kinetic energy (KE) versus its potential energy (PE) during a few cycles on 4° slope; Figure 18a corresponds to the damperless motion, and Figure 18b corresponds to the motion with a 0.15-Nm/rad/sec damper. Let us concentrate on the first figure. As reported by Goswami, Espiau, and Keramane (1996), the KE versus PE plot of a damperless compass robot consists of two straight lines: a constant-PE horizontal line representing the ground impact, and an inclined line representing the swing stage. The conservation of total mechanical energy of the robot during the swing stage ensures that the inclined line makes a 135° angle with the KE axis. In Figure 18a we see that the PE of the robot decreases by a constant amount at every step. For

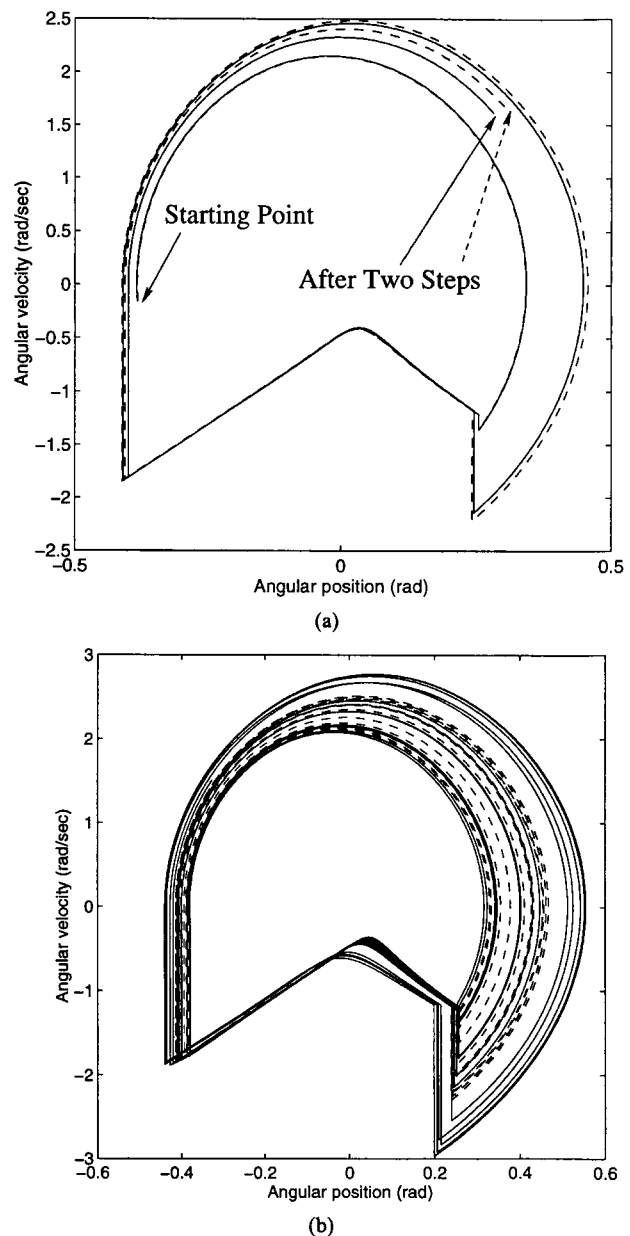


Fig. 15. The divergence of nearby trajectories in the phase plane of a biped robot, a phenomenon normally observed in a system with chaotic dynamics. The initial  $\dot{\theta}_{ns}$  between the two trajectories differs by 0.001 rad, while the other three state variables are exactly identical. Even after only two steps (a), the difference between the trajectories (shown in solid and dotted lines) is clearly identifiable. After 12 steps (b), the trajectories bear no resemblance to each other although they lie on the same attractor.

5. Dampers may increase the size of the limit cycle's basin of attraction for a given slope, but a better tool for estimating the size of the basin is needed to prove it.

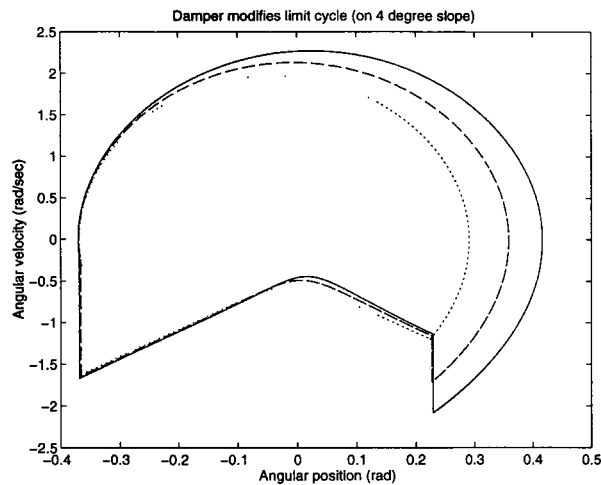


Fig. 16. Three different limit cycles for gaits on a  $4^\circ$  slope. The largest (solid line) corresponds to damperless motion. The other two cycles are obtained by placing quadratic dampers of coefficients  $0.08 \text{ Nm/(rad/sec)}^2$  (dashed line) and  $0.15 \text{ Nm/(rad/sec)}^2$  (innermost dotted line) in the hip joint of the robot.

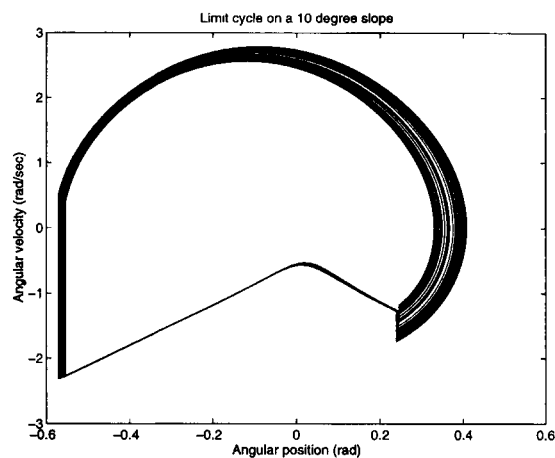
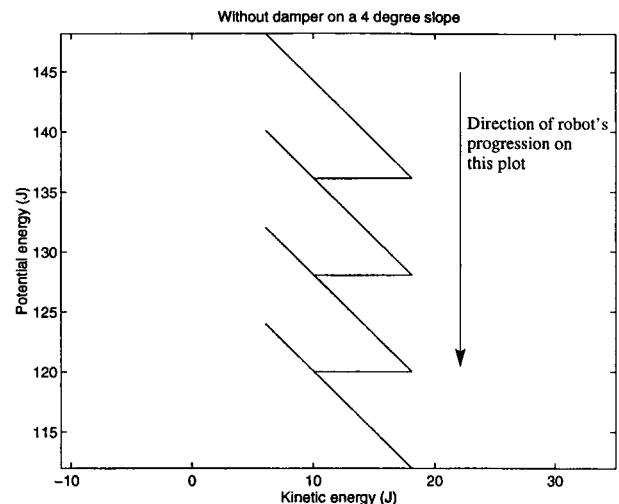
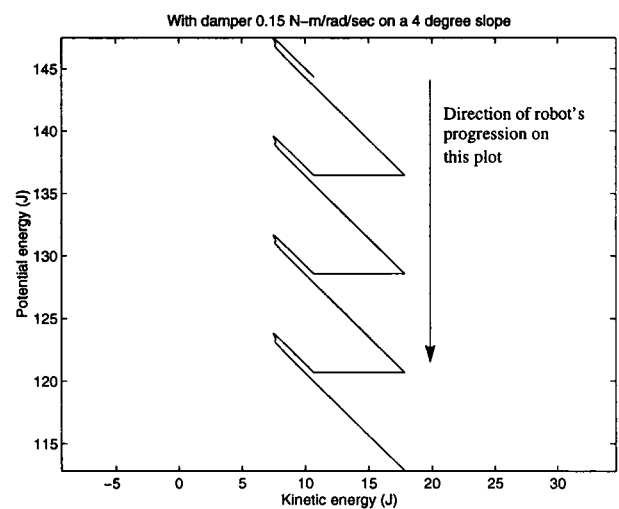


Fig. 17. The phase diagram of the compass robot with a passive quadratic hip damper (with a coefficient  $0.23 \text{ Nm/(rad/sec)}^2$ ) walking down a  $10^\circ$  slope with a steady gait.



(a)



(b)

Fig. 18. The KE versus PE plots during steady robot gaits on a  $4^\circ$  slope: (a) a damperless motion; and (b) the motion of the robot having a  $0.15\text{-Nm/rad/sec}$  quadratic hip damper. The swing-stage dissipation of energy modifies the robot's behavior, as is visible from the second plot.

a steady gait, precisely this amount of KE is absorbed during the ground impact.

In the presence of a damper, the situation is different. Since the damper continuously dissipates energy during the swing stage, the latter is no longer Hamiltonian, and is therefore not represented by a single inclined line. It becomes a curve, the exact nature of which depends on the robot dynamics and the damper coefficient (see Fig. 18b). To exhibit a steady gait, the PE lost by the robot during a step must be exactly equal to the *sum* of the energy absorbed during the ground impact and the energy absorbed by the damper during the

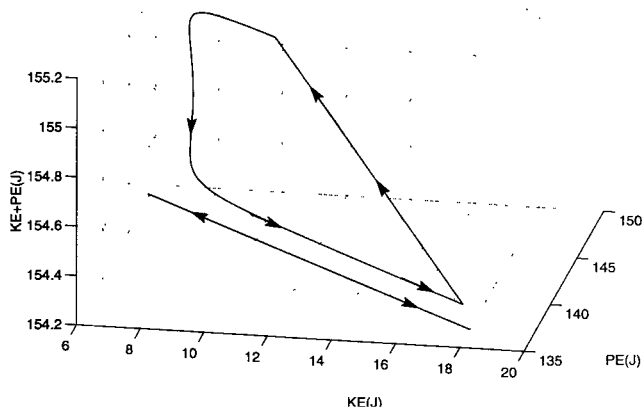


Fig. 19. Three quantities are illustrated: KE, PE, and total mechanical energy (KE + PE) of the robot during a steady cycle on a  $4^\circ$  slope. The straight line at the bottom corresponds to a damperless robot for which (KE + PE) is constant. Introducing a damper causes a continuous dissipation of system energy during motion, which results in a more complicated energy diagram, given by the loop. The straight line joining the extreme right-hand corner of the loop to its upper portion represents the instantaneous energy absorption due to the ground impact coupled with a simultaneous shift of the coordinate frame to reinitialize potential energy.

swing stage. The ground-impact phase remains unchanged, and is represented by a horizontal line.

In Figure 19, we visualize the differences in the energy dynamics for the gaits of a robot with and without a damper. The figure plots KE versus PE versus (KE + PE) during one gait cycle. The value of the PE in this case is reinitialized at each touchdown such that for a steady gait it is a cyclic quantity and is not monotonically decreasing. For a robot without any damper, the total energy (KE + PE) is constant during the swing stage and is thus represented by the horizontal line shown at the bottom of this figure. In a cyclic gait, the robot repeatedly traces this line. With a damper dissipating energy, the quantity (KE + PE) continuously changes during the motion of the robot, and is shown by the superposed closed curve. The straight line joining the extreme right-hand corner of the curve to its upper portion represents the instantaneous kinetic energy absorption due to the ground impact coupled with a simultaneous shift of the coordinate frame to reinitialize the potential energy. In fact, one cycle of each of the plots in Figure 18 is the horizontal projection of Figure 19 (the straight line and the loop).

We conclude this section with a few comments. It is useful to recall that the addition of linear or quadratic dampers does not alter the passive status of the robot. We can extend the repertoire of passive elements by adding passive springs to

the robot's joints. Compared to natural human locomotion, the passive elements may resemble the inherent damping and compliance of human joints.

The passive elements can be easily imitated by a control law in an active robot. It will be interesting to incorporate control laws based on active physical elements (such as negative dampers and negative springs) and see if the robot can climb uphill. A control law for the uphill walk of the robot was presented by Goswami, Espiau, and Keramane (1997).

Our results apparently contradict the findings of McGeer (1990), which reported that even a small amount of friction (by which damping was meant) in the hip joint can destroy the cycle. We have found that the original cycle is modified to another cycle rather than being destroyed.

Finally, let us mention that the addition of a quadratic damper  $\propto (\theta_{ns})^2$  dramatically influences the robot's behavior. With this damper in action, the robot can possess extremely large limit-cycle attraction basins and can deal with steep slopes (we have found steady gaits up to  $20^\circ$ ) that are impossible otherwise. The implications of this are unclear, and the implementation of such a damper (either passively or actively) is, at least, not straightforward.

## 6. Conclusions and Future Work

We have made a systematic study of the passive gait of a planar biped robot with compass-like motion. We have shown that any of the three parameters, namely, the ground slope and the normalized mass and length of the robot, affect the robot gait in the same qualitative manner. As we gradually increase one of the parameters, the symmetric and steady stable gaits of the unpowered robot evolve through a regime of bifurcations characterized by progressively more complicated asymmetric gaits, eventually arriving at an apparently chaotic gait where no two steps are identical.

Although it could not predict the long-term behavior of the robot, the linear model helped us make guesses about the initial states of the robot that lie in the basin of attraction of a limit cycle corresponding to the slope. We found that the linear model was valid for small  $\beta$  and small  $\mu$ . It was interesting to note that the validity of the linear solution was not a function of the third parameter,  $\mu$ .

The asymptotic stability of a dynamic system must be accompanied by a reduction of the phase-fluid volume, and the only source of volume contraction in this idealized frictionless robot was the transition equations. We have measured the phase-fluid volume contraction that quantifies the rate of convergence of nearby trajectories. A typical contraction ratio was calculated to be 0.1, showing strong contraction.

Presence of a passive damper in the hip joint (the only real joint) of the robot significantly increases gait stability and versatility. Although even a linear damper has a beneficial influence, we chose to present the results based on quadratic

dampers for their better performance. With the other three parameters constant, different dampers produce different gait cycles. Note that our results apparently contradict the findings of McGeer (1990) who reported that a hip damper destroys a stable limit cycle.

Before discussing the possible extensions of this work, let us mention two interesting facts regarding the behavior of the robot. First, we have found that the robot can accept, without falling down, a much larger perturbation of the velocity states than the position states. For example, for the gait on a 3° slope, the state  $\dot{\theta}_{ns}$  could absorb a perturbation of more than 100°/sec, whereas a perturbation of even 2° of the state  $\theta_{ns}$  takes the states out of the attraction basin. The same phenomenon was noted by McGeer (1990). Interestingly, we have noticed similar behavior for a different system with impacting elements (Mata-Jimenez, Brogliato, and Goswami 1997) governed by hybrid equations. Is this behavior common to all systems, hybrid systems, and/or those involving impacts?

A second fact is that there is a strong indication that *all* the motion descriptors of the gait of a given robot model are specified by only one parameter; namely, the ground-slope angle. This hints toward a strong underlying organizing principle.

For the future, it is possible to place passive biped robots in the larger perspective of passive machines, including not only massive links, but also the other passive elements such as springs and dampers. This will necessitate a systematic study of the effect of these other elements on the purely inertial dynamics of the robot. We can furnish three main reasons to support this study. First, as we have already seen in this article, additional passive elements are very promising in significantly improving the gait stability and gait versatility. Second, we obtain a rich source of simple active-control laws that may mimic the physical behavior of passive elements. Third, a better understanding of the gait itself may be obtained by analyzing the role played by the passive elements.

The transition equations play a fundamental role in the global dynamics of the robot. Our transition equations are derived from the law of conservation of angular momentum, which models the effect of ground impact on the robot. There are other ways to address the issue. One can, for example, create a physical spring-damper model of the ground and add it to the robot model. In any case, the results will be reliable if the gait features are qualitatively preserved for small changes in the parameters of the model.

The difficulties in studying the behavior of this apparently simple biped mechanism are, to a large part, due to its hybrid algebro-differential governing equations. Better analytical tools for dealing with such systems are needed. In particular, an estimation, even numerical, of the size of the basin of attraction of a limit cycle would be of immense value, both from the theoretical and practical points of view.

Currently, it is difficult to extend the insights obtained with a simple robot model to even a slightly more complex one. Our final challenge lies in the judicious interpretation of the

results obtained for this simple biped so that we can progress toward our objective of understanding human locomotion and extend the results to higher degrees-of-freedom robots.

## References

- Bergé, P., Pomeau, Y., and Vidal, C. 1984. *Order within Chaos*. New York: Wiley.
- Berkemeier, M. D., and Fearing, R. S. 1992 (Nice). Control of a two-link robot to achieve sliding and hopping gaits. *Proc. of the IEEE Conf. on Robot. and Automat.*, vol. 1. Los Alamitos, California: IEEE, pp. 286–291.
- Block, D. J., and Spong, M. W. 1995 (Peoria, IL). Mechanical design & control of the Pendubot. *SAE Earthmoving Ind. Conf.*
- Coleman, M., and Ruina, A. (1998). An uncontrolled walking toy that cannot stand still. *Phys. Rev. Lett.* 80(16):3658–3661.
- Espiau, B. 1997 (July, Monterey). Bip: A joint project for the development of an anthropomorphic biped robot. *Proc. of the Int. Conf. on Adv. Robot.*
- Espiau, B., and Goswami, A. 1994 (September, Capri). Compass gait revisited. *Proc. of the IFAC Symp. on Robot Control (SYROCO)*, pp. 839–846.
- Formal'sky, A. 1997. Ballistic locomotion of a biped. Design and control of two biped machines. In A. Morecki and K. J. Waldron, (eds.) *Human and Machine Locomotion*. Italy: Udine.
- François, C. 1996. Contribution à la locomotion articulée dynamiquement stable. Ph.D. thesis, Ecole des Mines de Paris (in French).
- Garcia, M., Chatterjee, A., Ruina, A., and Coleman, M. 1998. The simplest walking model: Stability, complexity, and scaling. *ASME J. Biomech. Eng.* 120:281–288.
- Goswami, A., Espiau, B., and Keramane, A. 1996 (April, Minneapolis). Limit cycles and their stability in a passive bipedal gait. *Proc. of the IEEE Conf. on Robot. and Automat.* Washington, DC: IEEE, pp. 246–251.
- Goswami, A., Espiau, B., and Keramane, A. 1997. Limit cycles in a passive compass-gait biped and passivity-mimicking control laws. *J. Autonomous Robots* 4:273–286.
- Goswami, A., Thuilot, B., and Espiau, B. 1996 (October). Compass-like biped robot Part I: Stability and bifurcation of passive gaits. Technical Report 2996, INRIA.
- Grishin, A. A., Formal'sky, A. M., Lensky, A. V., and Zhitomirsky, S. V. 1994. Dynamic walking of a vehicle with two telescopic legs controlled by two drives. *Int. J. Robot. Res.* 13(2):137–147.
- Guckenheimer, J., and Holmes, P. 1983. *Nonlinear Oscillations, Dynamical Systems, and Bifurcations*. New York: Springer-Verlag.
- Hayashi, C. 1985. *Nonlinear Oscillations in Physical Systems*. Princeton, New Jersey: Princeton University Press.



- Heckbert, P. S. (ed.) 1994. *Graphics Gems IV*. New York: Academic Press.
- Hilborn, R. C. 1994. *Chaos & Nonlinear Dynamics*. Oxford: Oxford University Press.
- Hurmuzlu, Y., and Chang, T. H. 1992. Rigid-body collisions of a special class of planar kinematic chains. *IEEE Trans. on Sys. Man Cybernet.* 22(5):964–971.
- Hurmuzlu, Y., and Moskowitz, G. D. 1986. The role of impact in the stability of bipedal locomotion. *Dyn. Stability Sys.* 1(3):217–234.
- Hurmuzlu, Y., and Moskowitz, G. D. 1987. Bipedal locomotion stabilized by impact and switching: I and II. *Dyn. Stability Sys.* 2(2):73–112.
- INRIA 1997 (February). Scilab 2.2. INRIA Domaine de Voluceau, Rocquencourt, France. electronic mail [scilab@inria.fr](mailto:scilab@inria.fr); World Wide Web <http://www.rocq.inria.fr/scilab/>; ftp <ftp.inria.fr/>.
- Kato, R., and Mori, M. 1984. Control method of biped locomotion giving asymptotic stability of trajectory. *Automatica* 20(4):405–411.
- Koditschek, D., and Bühler, M. 1991. Analysis of a simplified hopping robot. *Int. J. Robot. Res.* 10(6).
- Lanczos, C. 1986. *The Variational Principles of Mechanics*. New York: Dover.
- Mata-Jimenez, M., Brogliato, B., and Goswami, A. 1997. On the control of mechanical systems with dynamic backlash. Paper presented at the CDC Conference, San Diego, CA.
- McCloskey, R. T., and Burdick, J. W. 1991 (April, Sacramento, CA). An analytical study of simpl hopping robots with vertical and forward motion. *Proc. of the IEEE Conf. on Robot. and Automat.*, vol. 2. Los Alamitos, CA: IEEE, pp. 1392–1397.
- McGeer, T. 1990. Passive dynamic walking. *Int. J. Robot. Res.* 9(2):62–82.
- McMahon, T. A. 1984. *Muscles, Reflexes, and Locomotion*. Princeton, New Jersey: Princeton University Press.
- Mochon, S., and McMahon, T. A. 1981. Ballistic walking: An improved model. *Math. Biosci.* 52:241–260.
- Ostrowski, J. P., and Burdick, J. W. 1993 (May, Atlanta, GA). Designing feedback algorithms for controlling the periodic motions of legged robots. *Proc. of the IEEE Conf. on Robot. and Automat.*, vol. 2. Los Alamitos, CA: IEEE, pp. 260–266.
- Parker, T. S., and Chua, L. O. 1989. *Practical Numerical Algorithms for Chaotic Systems*. Berlin: Springer.
- Raibert, M. H. 1986. *Legged Robots that Balance*. Cambridge, Massachusetts: MIT Press.
- Rose, J., and Gamble, J. G. (eds.) 1994. *Human Walking*. Baltimore, Maryland: Williams & Wilkins.
- Spong, M. W. 1995. The swing-up control problem for the Acrobot. *IEEE Control Sys.* 15(1):49–55.
- Thuijlot, B., Goswami, A., and Espiau, B. 1997 (April, Albuquerque, NM). Bifurcation and chaos in a simple passive bipedal gait. *Proc. of the IEEE Conf. on Robot. and Automat.* Washington, DC: IEEE, pp. 792–798.
- Troger, H., and Steindl, A. 1991. *Nonlinear Stability and Bifurcation Theory*. Wien: Springer-Verlag.
- Vakakis, A. F., and Burdick, J. W. 1990 (May, Cincinnati, OH). Chaotic motions in the dynamics of a hopping robot. *Proc. of the IEEE Conf. on Robot. and Automat.*, vol. 3. Los Alamitos, California: IEEE, pp. 1464–1469.
- Yang, J.-S. 1994. A control study of a kneeless biped locomotion system. *J. Franklin Inst.* 331B(2):125–143.