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## Measuring local and global vibration modes in model plants



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## ABSTRACT

Model plants are extensively used in biological studies, and their mechanical behaviour needs to be better understood, in relation to studies in mechanoperception for instance. We present here the first approach to derive experimentally the modal parameters of two of these plants, *Arabidopsis thaliana* and *Populus tremula* × *alba*. A classical sinusoidal sweep excitation is used, with a measurement of displacements based on LKT optical flow tracking, followed by a bi-orthogonal decomposition (BOD). This allows us to estimate several modal frequencies for each plant, as well as the corresponding spatial localizations of deformation. Analyzing the modal frequencies, we show that global and local modes correspond to distinct ranges of frequencies and depend differently on plant size. Possible phenotyping applications are then discussed.

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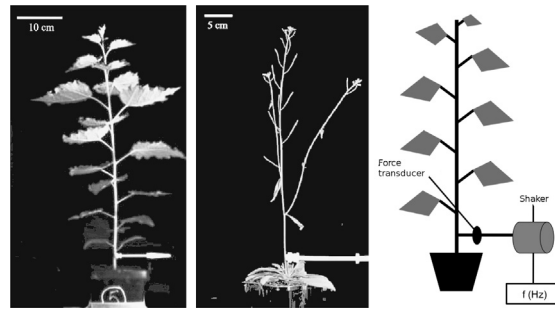
## 1. Introduction

Plant biomechanics addresses issues related to a very large variety of organisms, from spores to trees, and takes both fundamental and applied points of view. In the development of plant biology, model plants play a key role as they allow to focus fundamental or applied studies on genomically sequenced organisms. Two of these model plants, *Arabidopsis thaliana* and *Populus tremula* × *alba* (referred to as At and Pt in the following) are often considered in fundamental biology studies where mechanical issues are involved [1]. Unfortunately, whereas these model plants are known in great detail in terms of genetics [2], little is known of their mechanical behaviour. To investigate issues such as the perception of deformation by plants (thigmomorphogenesis [3]) it becomes necessary to have a good view of how a plant deforms under external load. More precisely, vibrational characteristics such as modal frequencies are largely unknown, while the dynamic response to excitations such as wind is known to affect growth.

In parallel, the dynamics of other plant species such as trees or crops have been extensively studied, see for instance [4]. Generally only the first mode of vibration has been measured and modelled. This fundamental mode is known to carry a large part of the response to wind, but higher frequency modes have also been shown to play an important role in dissipation of motion [5]. This led recently to several experimental and theoretical studies on the multimodal dynamics of these multi-branched systems such as trees. One of the key recent results was that these higher modes are localized in

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**Fig. 1.** Model plants and experimental set-up. Left: Young poplar *Populus tremula* × *alba*, denoted Pt in the text. Centre: Floral stem of *Arabidopsis thaliana* denoted At in the text. Right: schematic view of the excitation by the shaker.

space [6], a living illustration of the general concept of localization of branched systems [7]. For crops, such as wheat or alfalfa, little is known outside their fundamental mode of vibrations [8,9].

At the growth stage where they are studied by biologists, model plants such as Pt or At do not have the same geometrical characteristics as fully grown trees which have up to eight orders of regular branching. They however display very contrasted shoot architecture with different level of mechanical heterogeneities: young Pt trees used as model plants are made of a straight stem with large leaves, with the apical part (referred to as “apex” in the following) being made of much more compliant and soft tissues (Fig. 1, left). In contrast, At plants, at the inflorescence stage, are generally composed of a few leaves close to the ground (with little possible deformations), but develop a branched floral stem (inflorescence) that is slender and subjected to deformation, see Fig. 1, centre. Note also that for biological studies, both At and Pt are usually grown in pots, with substrates (i.e. artificial soil) of weak cohesion.

Measuring the modal properties, such as frequencies and modal shapes, of such systems is a challenge. For large trees, standard modal methods of modal analysis have been used, such as excitation by pull and release or hammer impact, with accelerometers or strain gages, see [4]. Here, in small model plants, tissues are soft, organs are very light, and the mechanical experiments should not be destructive or too invasive. Using a shaking table must be avoided because of the softness of the soil. Moreover, because of the large variability in geometry among plants of a given species at a given age, only statistical results have some meaning. This implies that a large number of experiments is undertaken, and therefore that the method used has to be simple enough.

The aim of the present paper is to present a new approach to measure modal quantities in such systems, and to give a first interpretation of the results in terms of potential localization of the modes and frequencies. The further application of this technique will also be discussed.

## 2. Materials and methods

### 2.1. Plants

We consider two sets of plants, the young Poplar *Populus tremula* × *alba* and *Arabidopsis thaliana* at the stage where it develops a floral stem. More precisely, hybrid polars (*P. alba* × *tremula* clone INRA 717-1B4) were obtained by *in vitro* micropropagation and grown on nutrient solution [10]. These trees were grown in a greenhouse with controlled temperature and irrigated by subirrigation. The experiments are conducted on seven young unbranched poplars (Fig. 1, left) taken at different stages of growth with total heights between 18 cm and 100 cm. The *Arabidopsis thaliana* plants were grown in a greenhouse under a 16 h light/8 h dark regime at 21°C, 55% relative humidity (Fig. 1, centre). A set of 24 At plants was used. The height of the main stem varied from 10 cm to 25 cm. These two sets of plants are kept under standard thermal conditions during the vibration experiments, by using low-temperature LED lighting for the visual acquisition.

### 2.2. Excitation

The proposed method is based on a sinusoidal excitation, with a slow sweep in frequency. Each plant is excited by a shaker attached close to the base of the stem (Fig. 1, right). The shaker (PCB Piezotronics, K2007E01) is controlled by a low-frequency generator (AIM-TTI, model TG2000). For most tests on Pt, the applied load was measured by a force transducer (PCB Piezotronics, 288D01SN2715). Sweeps of 2 Hz, lasting 30 s, are used. The range of sweeps was chosen such that no more than one mode is found in a given sweep. As Pt and At have quite different masses and stiffness, the excitation has to be adapted in terms of frequency range: Pt plants were stimulated between 0 and 36 Hz (18 sweeps), and At ones between 0 and 24 Hz only (12 sweeps). The level of excitation, of the order of 0.1 N, was also adapted to have small amplitude of motion, yet measurable. As only linear modal characteristics are sought, the magnitude of the force does not affect the results.



**Fig. 2.** Left: Visualization of the oscillating motion using image superposition. Centre and right: Example of the result of a BOD decomposition. Dominant spatial structure, or chronos (center), and the corresponding temporal structure, or topos (right). The peak of the chronos corresponds to a resonance and allows the identification of the modal frequency.

### 2.3. Measurement of displacement

The motions of the plants are recorded with a high-speed camera (*Vosskuhler HCC-1000BGE*), using a high level of light with a LED system to avoid increasing the temperature of the plants. The frequency of capture is such that it is always more than five times the frequency of the excitation. A typical motion is illustrated in Fig. 2 by image superposition over a period. The movies corresponding to each sweep on a 2-Hz range are then processed to derive the displacement of material points during that sweep, using the Kineplant-CR toolbox in MATLAB (*The MathWorks*), detailed in [11], as follows. First, a set of about 200 materials points displaying high orthogonal gradients in grey-level intensity (“good features to track”) is automatically selected using the Tomasi–Kanade method [12]. To improve the selection of points, based on local gradients of color intensity, additional marks were added on the *At* plants. These points are tracked from image to image using a multi-scale implementation of the Lucas–Kanade algorithm [13]. This allows us to derive the displacement field evolution with time, denoted  $X(M, t)$ , where  $M$  denotes the current material point.

To extract the dominant features of the movement, we then use for each sweep the same decomposition method as in [9,11,14], based on Bi-Orthogonal Decomposition (BOD) [15], such that:

$$X(M, t) = \sum_k \alpha_k \Psi_k(M) \mu_k(t) \quad (1)$$

This unique decomposition yields a series of BOD modes, composed of a spatial part,  $\Psi_k(M)$ , called the *topos* and a temporal part,  $\mu_k(t)$ , called *chronos*. The amplitude coefficients  $\alpha_k$  give the relative contribution of each BOD mode to the measured motion during the whole sweep. Note that the topos that are extracted by the BOD decomposition out of the evolution of displacement during a given sweep are not the normal modes of vibration of the system. Yet, as detailed below, if a resonance occurs in the sweep, the motion will be dominated by the response of the resonating normal mode of vibration, and the topos will be a measure of the modal shape.

### 2.4. Identification of modes

The identification of modes in a given frequency sweep is based on the assumption that if a modal frequency exists in the swept range, the motion will be dominated by the resonant response on this particular mode. This assumes that dampings are not too large, and that the ranges of sweep can be made small enough so that there exists at the most one mode in a given range. The results from the bi-orthogonal decomposition allow us to quantify the dominance of one mode in the response: if one of the  $\alpha_k$  clearly dominates the others, we assume that a single mode is present, with a modal frequency in the intervals of the sweep, and a modal shape which is the corresponding *topos*  $\Psi_k(M)$ . The criterion used is that the  $\alpha_k$  is three times (respectively five times) larger than the next one in magnitude, for *At* and *Pt* respectively. Conversely, if no dominant spatiotemporal structure appears in the response, it can be stated that there is no mode in that range of frequency. Fig. 2 shows the dominant *topos* and *chronos* pair in a sweep from 0 to 2 Hz on a *Pt* plant.

To give a finer estimate of the modal frequency, better than the 2-hertz range of the sweep, the chronos is then analyzed. Because of the slow variation of frequency in the sweep, the variation with time of the amplitude of the chronos corresponds to the variation with frequency. A resonance peak is expected to exist at the modal frequency, with a shift of phase between the displacement function  $\mu_k(t)$  and the applied load measured by the transducer. When these features are clearly detected, as in Fig. 2, the modal frequency is set at that of the forcing at the time of the resonance. Otherwise the modal frequency is set at the mean value of the sweep range.

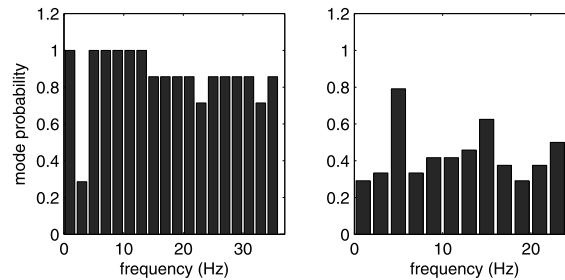


Fig. 3. Mode probability in the two plant populations for each range of sweep. Left: Pt. Right: At.

### 3. Results

#### 3.1. Modal densities

The existence of a resonant mode in a given sweep can be represented as a probability. This mode probability can be estimated by the systematic analysis of 18 sweeps for each one of the 7 Pt trees, and 12 sweeps for each one of the 24 At plants. A mode probability of 1 for a given sweep range means that all tested plants display a modal frequency in that range. Fig. 3 shows that for Pt, modes were found for all plants in almost all 2-Hz intervals, from 0 to 36 Hz. For At plants, only a few intervals contained modes for a majority of plants.

These high modal densities are consistent with the results of previous theoretical and experimental work on trees and other branched systems, see for instance [6,16,17], where such a density is usually associated with a localization of deformations in space.

#### 3.2. Global and local modes

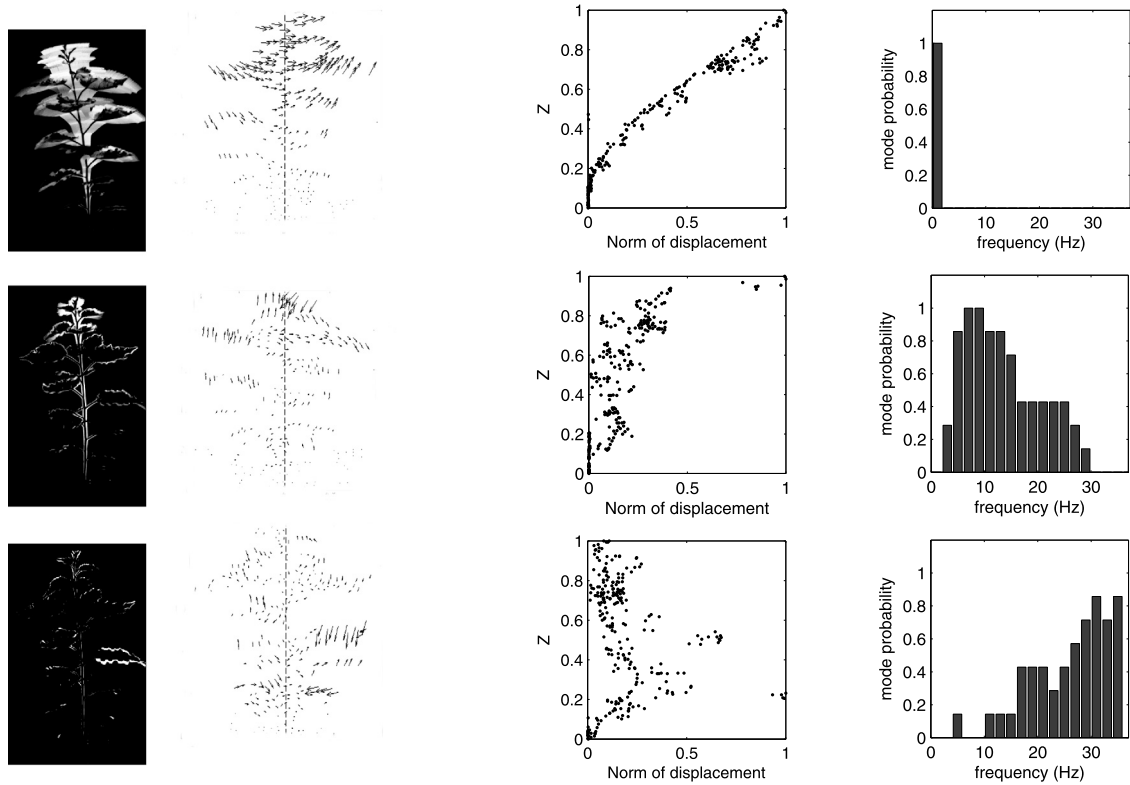
We now analyze the modal shapes  $\Phi_N(M)$  corresponding to the modal frequencies. They are estimated as the spatial functions of the dominant mode  $\Psi_1(M)$  of each interval, if there is one. A large variety of mode shapes is found, some involving deformation of the whole plant, and some of only part of the plant, as illustrated in Figs. 4 and 5. To quantify this spatial distribution of deformation in the plant, and access possible localization, we compute the norm of the displacement vector  $\Phi_N(M)$  at each point  $M$  as a function of the vertical coordinate of  $M$  (see examples in Figs. 4 and 5). A simple criterion may then be used to classify these modes, as follows. For both At and Pt plants, a mode is noted as *global* when more than 50% of points have a norm of the displacement larger than 33% of the maximum. This corresponds to modes involving essentially bending of the stem (in Pt) or of the main branches (in At)—see Figs. 4 and 5. Other modes are noted as *local* modes. For Pt, two types of these local modes are found. The first type involves only the tip of the tree, as illustrated in Fig. 4 (middle), and are referred to as apex modes. The second type have a localized deformation on individual leaves, Fig. 4 (bottom). For At plants, local modes involve the motion of small organs attached to the branches, called silica (Fig. 5).

The mode probability for each type of mode is also given in Figs. 4 and 5. Evidently, for Pt, there is a direct link between the spatial localization and the range of frequency. The global modes are only found at very low frequency, about 1 Hz. Frequencies of apex modes are in a separate, higher range, and those of leaf modes still higher. It is worth noting that this separation of frequencies is found by considering a set of seven Pt plants, covering a broad range of sizes and morphologies. For the At plants, the organization of frequencies is somewhat different, as can be seen from their mode probability: global and local modes span across the whole range of frequencies, with a slight bias towards lower frequencies for global modes.

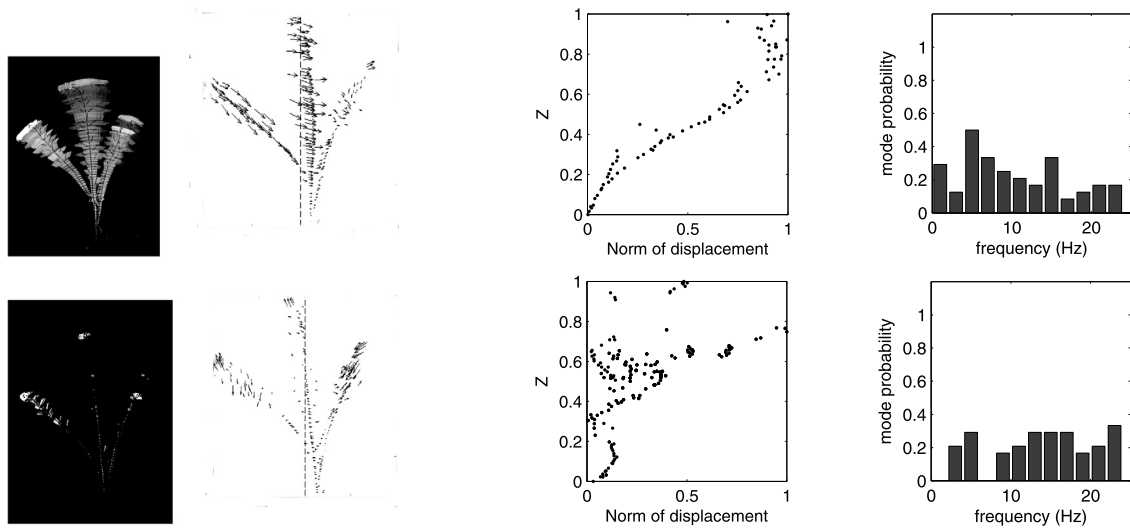
#### 3.3. Relation between modal frequency and plant size

The results presented above did not take into account the large variety of sizes of plants in the two sets. To evidence the role of this parameter, we compute, for a given plant, the mean value of the frequencies of modes of each category, as defined above. This mean frequency is shown as a function of the plant height in Fig. 6.

Here, the global and local modes differ statistically in their dependence on plant size. Fig. 6 shows that the global modes of At and Pt decrease with plant size (the  $R^2$  determination coefficient over a power law being of 0.91 for Pt and of 0.36 for At). However, the dependence with size is quantitatively very distinct: weaker in Pt than in At. These two variations fall between two theoretical dependence relationships that are shown on the same graph, based on the assumption that the frequency is essentially affected by geometrical effects [6]. For a beam of diameter  $D$  and length  $L$ , the frequencies of the bending modes of vibration vary as  $D/L^2$ . This can be generalized to non-uniform systems in bending, see [6], where  $D$  and  $L$  are the diameter and height scales, respectively. Therefore, a dependence in  $L^{-2}$  corresponds to plants that are homothetic in height only with identical diameters. Alternatively, a dependence of frequencies as  $L^{-1/2}$  is associated with plants where length and diameter are linked by the often described allometric law where  $D$  varies as  $L^{3/2}$  [6]. The two model plants we have considered here have a dependence of frequencies on size that fall between these two models, At being closer to the



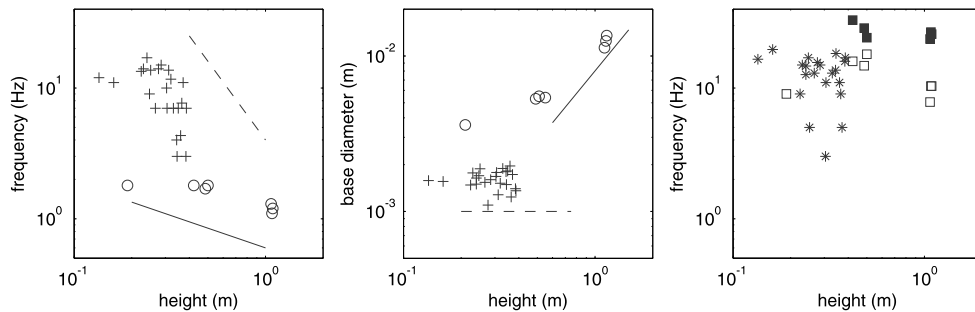
**Fig. 4.** Localization of modes and frequencies in Pt. From top to bottom: global stem modes, local apex modes, local leaf modes. From left to right: for a given mode type, visualization of a typical mode shape by superposition, modal displacement field and norm of the modal displacement along the normalized plant height, and mode probability of that type. The frequency of the modes shown to exemplify each type are respectively 1.7, 19 and 31 Hz.



**Fig. 5.** Localization of modes and frequencies in At, with the same presentation as in Fig. 4. The modal frequencies are here 3 and 15 Hz.

first and Pt to the second one. This is confirmed by plotting the base diameter of all plants as a function of their height (Fig. 6).

For local modes, the correlation with plant size are weaker, with  $R^2$  coefficients 4.2 to 2.8 times smaller than for the global modes in Pt (for apex and leaves respectively), and 6.6 times smaller in At (for silica). In fact, local systems such as the apex, or the set of leaves or fruits (silica), are rather similar from plants to plants, and their mechanical characteristics do not depend on the size of the plants. Local modes are therefore not expected to depend on the height of the plant.



**Fig. 6.** Effect of plant size on frequencies. Left: global modes of *At* (+) and *Pt* (o). The dashed and solid lines correspond respectively to the  $-2$  and  $-1/2$  slopes of common models, see text. Center: Height and base diameters of *At* (+) and *Pt* (o). The dashed and solid lines correspond respectively to the  $0$  and  $3/2$  slopes of the same models. Right: local modes in *At* (\*) and in *Pt* (□, apex modes and ■, leaf modes).

#### 4. Discussion and conclusion

We have shown that modes of small model plants may be measured, both in terms of frequency and mode shapes. It should be noted that we have only analyzed here the modal shapes in their projection on a plane orthogonal to the axis of view. However, tests with a rotation of the plant gave the same sets of modes, which means that all modes have a three-dimensional motion. To obtain the full modal shape in three dimensions, the same procedure can be done using a stereo acquisition and 3D reconstruction. Other modal quantities such as modal damping or modal stiffness are also measurable, but would require finer data on the transfer function.

Although the plants of a given species differed largely from one to another, due to natural variability, we obtained some relevant statistical information on how modes are localized in frequency and space. The most striking feature is that modes are indeed localized in these plants, although they are not well-defined branched systems. This localization of modes in organs such as leaves, apex or silica, is probably due to the large range of bending stiffness that exists in a given plant. For instance, an order of magnitude of variation exists between the stem and a petiole.

These results may now be used in two directions. First, we know now which part of the plant is deformed in a given frequency range. The localization of deformation gives a basis to look for mechanosensitive tissues in the plant. This raises the question of the perception of frequencies of deformation by plants. A second possible application is in the vast domain of phenotyping [18]: the modal characteristics of a system do depend on mass, stiffness, and geometry, and may therefore be used to assess the potential variation of these parameters with genetics. The method proposed in the present paper has many advantages, being non-destructive and easily rendered automatic.

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