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## On-Line, Real-Time Measurements of Cellular Biomass using Dielectric Spectroscopy

JOHN E. YARDLEY, DOUGLAS B. KELL, JOHN BARRETT AND CHRISTOPHER L. DAVEY

Institute of Biological Sciences, University of Wales, Aberystwyth, Ceredigion SY23 3DA, Wales, U.K.

### Introduction

All else being equal, the productivity of a biological process is determined by the quantity of biomass present. There is, therefore, a major requirement for the accurate measurement and control of the biomass within fermentors, at both laboratory and industrial scales. Presently, the range of sensors available that can be used *in situ* and reliably for the monitoring and regulation of biotechnological processes in general is rather limited. These sensors normally rely upon physical (eg optical, mechanical and electrical) or chemical variables (eg pH and concentration) rather than biological ones per se (Sarra et al., 1996; Pons, 1991). However, only physical methods allow the online, real-time estimation of biomass (Harris and Kell, 1985). As well as physical methods, any easily determinable chemical that is produced or consumed by cells at an essentially constant rate during cell growth may also be used to assess biomass, eg carbon dioxide evolution and oxygen consumption. In these indirect methods, biomass is then calculated based upon mass balances, stoichiometric relationships or empirical constants. However, this type of approach has the great disadvantage that it does not generally discriminate between biomass and necromass (Kell et al., 1990).

Even if biomass was easily measurable, there is still the question of what is biologically relevant information for fermentation control and how can one define

Abbreviations: 2f method, two frequency method;  $\Delta C$ , capacitance increment;  $\Delta \epsilon$ . dielectric increment;  $\epsilon$ , relative permittivity;  $\epsilon_{\sigma}$  permittivity of free space;  $\sigma$ , conductivity;  $\sigma_{\tau}$  conductivity of cytoplasm;  $\sigma_{\omega}$  conductivity of medium; ATP, adenosine triphosphate; BM, Biomass Monitor; C, capacitance;  $C_{m}$ , plasma membrane capacitance;  $C_{s}$ , high-frequency capacitance; CHO. Chinese hamster ovary cells;  $f_{s}$  characteristic frequency; f-high, spot high-frequency; f-low-frequency; G, conductance; HeLa, Henrietta Lacks cells;  $f_{s}$ , half frequency; K, cell constant; K562, human leukaemia cells;  $f_{s}$ , magnitude of polarization; MDBK, Madin-Darby bovine kidney cells; N, cell concentration; OD, optical density; P, volume fraction; r, cell radius.

<sup>\*</sup>To whom correspondence may be addressed (cld@aber.ac.uk)

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and quantify it (eg metabolism, viability, vitality, morphology) (Kell et al., 1987; Kell, 1987a; Kell et al., 1990; Davey et al., 1998). Such data are usually complex in their acquisition (mainly off-line), time-consuming to measure, prone to human error and usually subjective in their interpretation, eg microscopic cell counting and viability staining.

In this survey we will review the measurement of biomass based on the passive electrical (dielectric) properties of biological materials. As will be discussed later, this technique has the advantage that it only detects cells with intact plasma membranes and so gives values that do correlate with biomass rather than necromass. The physics that forms the basis of this technique has been studied since the last century and has been reviewed in great detail by a number of authors (Grant *et al.*, 1978; Pethig, 1979; Pethig and Kell, 1987; Takashima *et al.*, 1988; Foster and Schwan, 1989; Davey and Kell, 1995; Rigaud *et al.*, 1996) and how this theory relates to (dielectric) biomass measurements has also been extensively reviewed and researched (Irimajiri *et al.*, 1975; Harris and Kell, 1983; Harris *et al.*, 1987; Kell, 1987b; Kell and Davey, 1990; Markx *et al.*, 1991a,b,c,d; Mishima *et al.*, 1991a; Sonnleitner *et al.*, 1992; Davey, 1993a,b; Matanguihan *et al.*, 1998; Davey and Kell, 1998a,b; Asami *et al.*, 1999; Krairak *et al.*, 1999; Markx and Davey, 1999).

For the purpose of this review, we will concentrate on the Biomass Monitor (BM, formerly called the βugmeter, Aber Instruments Limited, Science Park, Cefn Llan, Aberystwyth SY23 3AH, Wales, U.K. and see http://www.aber-instruments.co.uk) (Harris *et al.*, 1987; Davey *et al.*, 1999) as this has a large publication base and is the only commercial system available at the moment that can work in real fermentation environments, on-line and in real-time. The other more laboratory-based systems under development will be considered but, unless otherwise specified, the work being discussed will be studies using the Biomass Monitor (BM).

## The theory and practice of dielectric biomass estimation

## THE β-DISPERSION

For the purposes of this article, a simplified approach to dielectric dispersions and the dielectric approach to the estimation of biomass will be employed. References with more exacting explanations were mentioned in the introduction. For modelling purposes, a suspension of cells can be regarded as being composed of three separate parts. Within the (spherical) cells and surrounding them are conducting aqueous ionic media, the cell's cytoplasm and the suspension medium, respectively. The cytoplasm is a highly complicated and structured mixture of salts, proteins, nucleic acids and smaller molecules (Clegg, 1984). In addition, in eukaryotes various internal, membrane-bound structures are also present which can affect the cell's dielectric properties (Foster and Schwan, 1989; Asami et al., 1996). Surrounding the cell's conducting core is the plasma membrane, which is essentially non-conducting (Takashima et al., 1988). Thus, electrically a cell suspension can be regarded as a suspension of spherical capacitors each containing a conducting matrix (cytoplasm) and all surrounded by a conducting suspension medium.

When an electric field is applied to a suspension of cells in an aqueous ionic

## ELECTRONICS CONTROLLING

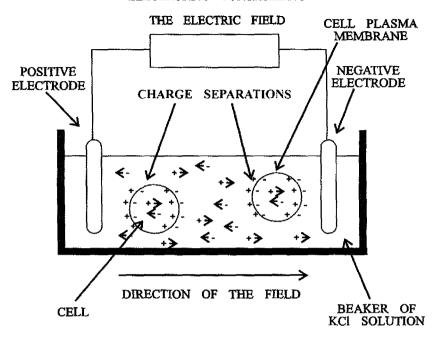


Figure 1.1. When an electric field is applied to a suspension of cells in an aqueous ionic solution, the positive ions are pushed in the direction of the field and the negative ions in the counter direction. The ions can only move so far until they encounter the cells' plasma membranes, which prevents further movement. This results in a charge separation or polarization at the poles of the cells.

solution, the ions in that solution are forced to move. The positively charged ions are pushed in the direction of the field, whilst the negatively charged ones are pushed in the opposite direction (Figure 1.1). The ions both inside and outside the cells can only move so far before they encounter the plasma membranes which act as an insulating physical barrier, preventing further movement. This results in the development of a charge separation or polarization at the poles of the cells (see Figure 1.1). The magnitude of the suspension's field induced separations is measured by its capacitance (C) in Farads (F). However, as a Farad is a very large capacitance, one normally sees its values expressed in pico-Farads (pF). Thus, by measuring the capacitance of the suspension at one or more appropriate frequencies, its biomass can be estimated (Harris et al., 1987; Kell et al., 1990; Davey et al., 1993a,b; Davey, 1993a,b; Kell and Todd, 1998) because, as the volume fraction of the cells increases, there are more polarized membranes which, in turn, gives a higher measured capacitance. Dead cells (operationally defined - Kell et al., 1998; Barer et al., 1998) and non-biomass solids do not possess intact plasma membranes and so do not polarize significantly, therefore they do not contribute significantly to the capacitance of the cell suspension (Harris et al., 1987; Stoicheva et al., 1989). Similarly, if oil droplets or gas bubbles are present in the medium, they do not contribute directly to the measured capacitance, as they are also not membraneenclosed particles. However, if they are present at high concentration they will reduce the net suspension capacitance by virtue of the fact that they are reducing the cellular volume fraction. In some rare cases, non-biomass solids do contribute a significant

## ELECTRONICS CONTROLLING

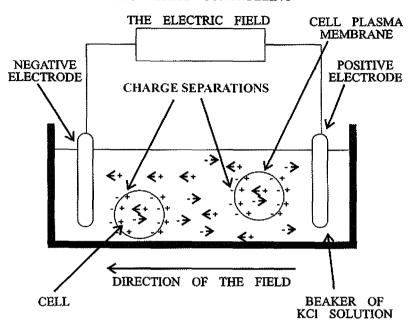


Figure 1.2. Figure 1.1 showed the applied electric field pointing in one direction only. If the direction of the electric field is reversed, then the only effect is to change the polarity (but not the magnitude) of the polarizations of the cells. This results in the measured capacitance of the cells remaining unchanged.

capacitance that interferes with biomass measurements; however, these contributions can be removed using multivariate techniques (Nicholson *et al.*, 1996).

To this point, we have only considered the electric field moving in one direction. If the electric field's direction is reversed, so is the polarity of the resulting charge separations (Figure 1.2). However, the magnitude of the polarization remains unchanged, and so the capacitance of the suspension also remains unchanged. The rate at which the electric field changes direction can also be varied. The number of times the field changes direction per second is measured by its frequency in Hertz (Hz). The greater the rate of change, the higher the frequency. Frequency has a marked effect upon the capacitance of a cell suspension as the ions moving up to and polarizing the plasma membranes take a finite time to reach them and cause the polarizations (Pethig, 1979; Foster and Schwan, 1986; Pethig and Kell, 1987).

Figure 1.3 illustrates the polarizations induced across the cells within a suspension as the frequency of the electric field is increased. At low frequencies, below approximately 0.1 MHz ((A)), many ions have time to reach the cells' plasma membranes before the field is reversed, driving the ions in the opposite direction. In this case, the induced polarizations are large, and hence the capacitance of the cell suspension is high. As the frequency is increased over 1 MHz ((B)), fewer ions have time to reach the plasma membranes before the field is reversed and, therefore, the extent of the transmembrane polarization is less, and hence the capacitance of the suspension is lower. At very high frequencies, typically 10 MHz and above ((C)), even fewer ions have time to polarize the membranes and so the resulting membrane polarization is small, giving a negligible

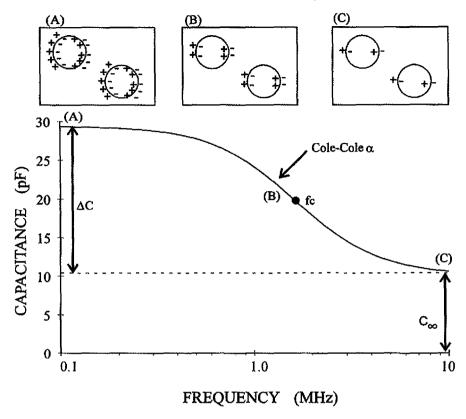


Figure 1.3. The capacitance of a cell suspension as a function of frequency shown along with the equivalent polarizations of the cells (the field is shown in one direction only). (A) is at approximately 0.1 MHz and many ions have time to reach the cells' plasma membranes before the electric field is reversed. As the frequency is increased over 1 MHz ((B)), fewer ions reach the cells' plasma membranes resulting in reduced membrane polarization and hence the suspension's capacitance is lower. At very high frequencies typically over 10 MHz ((C)), fewer ions have time to polarize the cell membranes before the field is reversed, this results in fewer polarizations and hence to a negligible contribution to the measured capacitance. Also shown on the figure are the terms used to describe a dispersion curve. The residual high-frequency capacitance is called C<sub>x</sub> and the height of the low-frequency plateau above this is the capacitance increment (ΔC). When the fall in capacitance is half completed, we have the characteristic (critical) frequency (f) and the steepness of this fall in capacitance is characterized by the Cole-Cole α.

contribution to the overall measured capacitance. What remains is a background capacitance due largely to the dipoles of the water in the suspending medium.

From Figure 1.3 one can see that, as the frequency is increased, the capacitance of the suspension falls from a high low-frequency capacitance plateau (maximal cell polarization) to a low high-frequency plateau (minimal cell polarization). This fall in capacitance, due to the loss of induced charging of the cells' plasma membranes as frequency is increased, is called the  $\beta$ -dispersion, and for most cells it is centred between 0.5 and 3 MHz (Pethig, 1979; Foster and Schwan, 1986; Pethig and Kell, 1987; Davey and Kell, 1995).

The residual high-frequency capacitance due to the medium is termed  $C_z$ , and the height of the low-frequency plateaux above this the  $\Delta C$  or capacitance increment of the  $\beta$ -dispersion (see *Figure 1.3*). The frequency at which the fall in capacitance is

half completed (ie at  $C_{\infty} + (\Delta C/2)$ ) is termed the characteristic (or critical) frequency ( $f_{\rm c}$ ). The measure of the steepness of the capacitance fall during a dispersion that is usually used (which is not its slope) is called the Cole-Cole  $\alpha$  (Cole and Cole, 1941; Cole, 1972). The Cole-Cole  $\alpha$  is a dimensionless quantity with values > = 0 but < 1, which nominally describes the distribution of relaxation times in the suspension (however, see Markx *et al.*, 1991a for evidence that this cannot be the reason in the case of the  $\beta$ -dispersion of biological cells, and also, for example, Jonscher, 1983). Typical values for biological cells are up to 0.2 (Davey and Kell, 1995) with some yeasts and bacteria going as high as 0.4. The effect these non-zero  $\alpha$  values has on biomass measurements will be discussed later.

With increasing biomass concentration, neither the  $f_c$  nor the  $C_\infty$  is significantly changed. However, what does change is the magnitude of  $\Delta C$ , which increases monotonically with biomass concentration. Thus, in order to estimate the biomass content of a cell suspension, one simply measures the magnitude of the  $\Delta C$  of the  $\beta$ -dispersion.

## MATHEMATICAL MODELS OF THE $\beta\text{-}DISPERSION$ : $\Delta C$ AND CELL SUSPENSION STRUCTURE

To discuss how the  $\Delta C$  of the  $\beta$ -dispersion relates to the structural features of the cells in the suspension, we must consider both capacitance and conductance in more detail. Capacitance gives a measure of a material's ability to store electrical energy as charge. Conductance (in Siemens (S), which the BM also measures) gives a measure of the ability to conduct charge and dissipate the electric field's energy as heat. Conductance increases as the concentration, valency and mobility of the ions in the solution increases. Both capacitance and conductance depend not only on the material being measured, but also on the geometry of the electrodes (and range setting of a BM: high or low) being used. Thus, for theoretical work in particular, it is convenient to normalize the values to a standard electrode geometry. Doing this converts capacitance (C, in Farads (F)) into relative permittivity ( $\epsilon$  (dimensionless), as it is relative to a vacuum), and conductance (G, in Siemens (S)) into conductivity ( $\epsilon$ , in S.m<sup>-1</sup>) (Kell, 1987a; Pethig and Kell, 1987; Kell and Davey, 1990).

The electrode geometry (and BM range setting) is encapsulated in the cell constant (K in m<sup>-1</sup>) of the system. To convert a measured conductance into conductivity one uses *Equation 1.1*:

$$\sigma = G K \tag{1.1}$$

As tables of the  $\sigma$  for aqueous KCl solutions at known temperatures are available, one can measure the conductance of a reference KCl solution (at a known temperature) and then calculate the cell constant of the system. For example, a dielectric spectrometer (eg a BM) gives a conductance of  $1.83 \times 10^{-3}$  S for 10 mM KCl at 20°C which, from the tables, has a conductivity of 0.1278 S.m<sup>-1</sup>. From Equation 1.1, we can calculate the cell constant as 70 m<sup>-1</sup>.

A measured capacitance can be converted to permittivity using:

$$\varepsilon = C (K/\varepsilon_0) \tag{1.2}$$

where  $\varepsilon_0$  is a constant called the permittivity of free space and is equal to 8.854 ×  $10^{-12}$  F.m<sup>-1</sup>. The relative permittivity is numerically equal to the capacitance of the

standard electrode with the material in it, divided by the capacitance of the same electrode containing a vacuum.

An important point about both Equations 1.1 and 1.2 is that the unnormalized values (G and C) are converted to their normalized counterparts ( $\sigma$  and  $\varepsilon$ ) by being multiplied by a constant (K and (K/ $\varepsilon$ <sub>0</sub>)) for the given measuring system. This means that the basic shape of the  $\beta$ -dispersion curve in Figure 1.3 is unchanged. All that happens is that  $\Delta$ C becomes  $\Delta\varepsilon$  (dielectric increment) and  $C_\infty$  becomes  $\varepsilon_\infty$ , whilst the  $f_\varepsilon$  and Cole-Cole  $\alpha$  are unchanged. If a dispersion had a  $\Delta$ C of  $10 \times 10^{-12}$  F when measured with a spectrometer system with a K value of 70 m<sup>-1</sup>, then by Equation 1.2 the  $\Delta\varepsilon$  is 79.

Of course, as the  $\Delta$ C of the  $\beta$ -dispersion is proportional to biomass content (up to moderate levels – see below) so is its  $\Delta\epsilon$ , and the theoretical work of Schwan (1957) allows us to relate the latter directly to the physical make-up of the suspension. His equation, which has been extensively checked experimentally (eg Harris and Kell, 1983; Davey and Kell, 1995), is:

$$\Delta \varepsilon = (9 \text{ Pr C}_{-}) / (4 \varepsilon_{0}) \tag{1.3}$$

where P (dimensionless) is the volume fraction of cells with intact plasma membranes (ie biomass), r is the radius of the spherical cells (m), and  $C_m$  is the plasma membrane capacitance in F.m<sup>-2</sup> (Ferris *et al.*, 1990).  $C_m$  gives a measure of the charge-storing ability of the membranes and has been found to be effectively a biological constant of  $(0.01 \pm 0.005)$  F.m<sup>-2</sup>. This is perhaps not surprising as it is governed by the thickness and permittivity of the hydrophobic core of membrane material (Hanai *et al.*, 1964; Hanai *et al.*, 1965; Everitt and Haydon, 1968; Coster and Smith, 1974; Laver *et al.*, 1984).

If we assume a  $C_m$  for yeast of 0.01 F.m<sup>-2</sup>, then from Equation 1.3 a suspension of yeast (radius,  $r = 3 \times 10^{-6}$  m) present at a volume fraction (P) of 0.01 will give a β-dispersion  $\Delta \varepsilon$  of 76.2. A BM standard 25 mm diameter probe used with a BM set to its most sensitive setting (low range) has a cell constant (K) of 70 m<sup>-1</sup>. From Equation 1.2 we can calculate that this  $\Delta \varepsilon$  corresponds to a measured  $\Delta C$  on the BM of  $9.6 \times 10^{-12}$  F (9.6 pF). If we had the same volume fraction of coccoid bacteria ( $r = 0.5 \times 10^{-6}$  m) under the same conditions, then Equation 1.3 would give the  $\Delta \varepsilon$  as 12.7 and hence a capacitance on the BM of  $1.6 \times 10^{-12}$  F (1.6 pF). This makes the general point that dielectric biomass estimations are proportionately more sensitive to larger cells than smaller ones.

If one is using *cell concentration* as the measurement of biomass, then *Equation 1.3* becomes:

$$\Delta \varepsilon = (3 \pi r^4 C_m N) / \varepsilon_0$$
 (1.4)

where N is the cell concentration in cells m<sup>-3</sup>. Figure 1.4 is a plot of  $\Delta \varepsilon$  versus cell concentration for different cell radii calculated using Equation 1.4. Once again, one can calculate the capacitances equivalent to the  $\Delta \varepsilon$  values using Equation 1.2.

For most fermentations r is constant which means that Equations 1.3 and 1.4 predict that there is a linear relationship between the volume fraction or concentration of intact cells and the measured  $\Delta \epsilon$  ( $\Delta C$ ). In fact, r can change slightly during a fermentation as cells often get slightly larger during exponential growth. To apply Equations 1.3 and 1.4 crudely to non-spherical cells we can think in terms of an equivalent radius, thus if the cells change morphology over time, this equivalent radius will also change. For most fermentations, these changes do not introduce

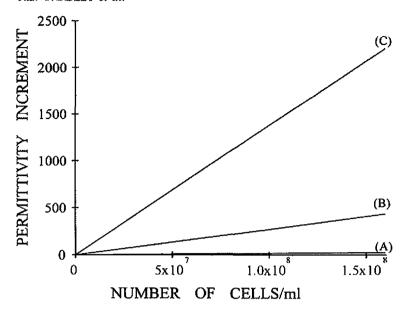


Figure 1.4. This shows a plot of permittivity increment ( $\Delta \epsilon$ ) versus cell numbers/ml (N) as calculated using Equation 1.4. The three cell radii (r) used were 2, 4 and 6  $\mu$ m; these correspond to the lines (A), (B) and (C) respectively ( $C_m$  was assumed to be 0.01 F.m<sup>-2</sup>). From Equation 1.4 one can see that the gradient of these lines depends on the fourth power of the radius of the cells.

significant errors in biomass measurements. The other point made clear by Equations 1.3 and 1.4 is that the working definition of biomass used in dielectric biomass estimations is that biomass means cells with intact plasma membranes. Non-culturable, dormant, or biochemically inactive cells which retain intact or largely intact plasma membranes are also measured as biomass. However, it has been found experimentally that this is not usually a source of major error under fermentation conditions (see the later literature review sections).

For cell suspensions with high volume fractions (P > 0.15), it has been found experimentally that  $\Delta\varepsilon$  ( $\Delta$ C) no longer increases linearly with volume fraction as predicted by *Equation 1.3*, but begins to plateau off. This plateauing has been successfully modelled by multiplying the right-hand-side of *Equation 1.3* by the additional term  $1/(1 + (P/2))^2$  (Schwan and Morowitz, 1962; Schwan *et al.*, 1970; Harris and Kell, 1983; Davey *et al.*, 1992).

Schwan (1957) also gives an equation for the characteristic (critical) frequency ( $f_c$ ) of the  $\beta$ -dispersion:

$$f_c = \frac{1}{2\pi r C_m \left( \left( \frac{1}{\sigma_i} \right) + \left( \frac{1}{(2\sigma_o)} \right) \right)}$$
 (1.5)

where  $\sigma_i$  and  $\sigma_o$  are the conductivities of the cytoplasm and suspending medium respectively. Thus, a yeast of radius (r)  $3 \times 10^{-6}$  m and  $C_m$  of 0.01 F.m<sup>-2</sup> with an internal conductivity ( $\sigma_i$ ) of 0.5 S.m<sup>-1</sup> suspended in a medium of conductivity ( $\sigma_o$ ) 0.8 S.m<sup>-1</sup> has a  $\beta$ -dispersion  $f_c$  of  $2.0 \times 10^6$  Hz (2.0 MHz) (for useful values to use in calculations

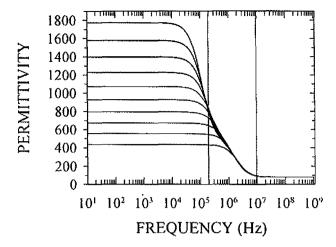


Figure 1.5. From this simulation we can observe the effects of cell morphology on the  $\beta$ -dispersion (at a constant volume fraction of 0.05). The lowest of the lines corresponds to a spherical yeast cell with a radius of 3  $\mu$ m. In the subsequent traces, the yeast cell has been drawn-out into a hypha of increasing length. The cross-section of this hypha is a circle of radius 3  $\mu$ m and each line above that of the sphere corresponds to an increase in total length of a further 6  $\mu$ m up to the top trace of tip-to-tip length of 60  $\mu$ m. The cells are assumed to be a homogeneous population of randomly orientated rigid prolate spheroids of revolution lacking a cell wall and with a completely insulating plasma membrane. The other assumptions are: membrane thickness = 4 nm; membrane permittivity = 4.5 ( $C_m$  is thus 0.01 F.m<sup>-2</sup>); suspension medium  $\sigma = 0.8$  S.m<sup>-1</sup>; cytoplasmic  $\epsilon = 60$  and the cytoplasmic  $\sigma = 0.5$  S.m<sup>-1</sup>. The BM's frequency range is denoted by the two vertical lines.

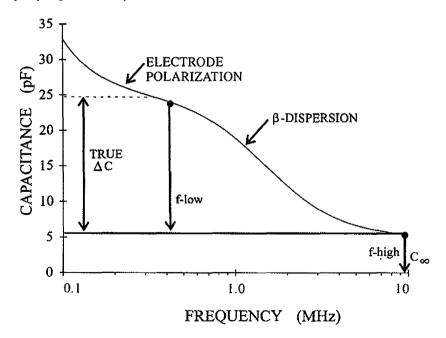


Figure 1.6. A hypothetical frequency scan of a cell suspension (solid line) showing the contribution of electrode polarization at low frequencies. The dashed line indicates the true low-frequency plateau of the β-dispersion unadulterated by electrode polarization. Also shown on the figure are the typical spot frequencies (f-low and f-high) at which single- and dual-frequency biomass estimations are made on the BM.

such as these see Davey and Kell, 1995). Research has shown that the cytoplasmic conductivity of such cells does not change significantly as one varies the external conductivity of a suspension (Beving et al., 1994). Thus, during a fermentation it will largely be changes in the external medium conductivity ( $\sigma_o$ ) that will cause the  $\beta$ -dispersion to move. Typically, such changes will result from the cell's metabolic activity or from the acid and alkali used for pH control. The implications of movements in  $f_o$  for biomass measurements will be discussed later.

To model non-spherical cells more accurately, alternative models to the ones above must be used (Asami et al., 1980; Asami and Yonezawa, 1995). A detailed description of these is beyond the scope of a review such as this as they typically involve the use of complex numbers and 3D geometry. Figure 1.5 shows the effect of cell morphology on the  $\beta$ -dispersion (at a constant volume fraction) calculated using the equations in Asami et al. (1980). As the cells become more elongated (prolate), a secondary low-frequency component to the  $\beta$ -dispersion becomes increasingly prominent. For very prolate cells, one can clearly see the two  $\beta$ -dispersions for the two different semi-axes of the cells. Also shown on the plot is the frequency range for the BM. It is clear that for filamentous fungi the limited frequency range of the BM results in only a fraction of the total signal being registered. It also explains why the dielectric spectra of tempe (a solid-state fermentation using the filamentous fungus Rhizopus oligosporus) that were measured using a BM were seen as a gentle slope rather than a defined step change (Davey et al., 1991; Penaloza et al., 1991; Penaloza et al., 1992).

### MEASUREMENT OF THE ΔC OF THE β-DISPERSION

To estimate the biomass concentration by measuring  $\Delta C$  ( $\Delta \epsilon$ ) we need convenient and practical ways of making these measurements. There are three means of estimating  $\Delta C$ : the first two rely on measurements at spot-frequencies and the third uses frequency scanning and curve fitting. In all three cases, one has first to perform off-line calibration measurements before actual biomass measurements can be carried out on-line. A dilution series of the cells of interest is made and the  $\Delta C$  of each is measured along with the required biomass output, eg the dry weight, cell concentration, etc. The resulting straight line calibration graph of capacitance versus required biomass output can then be used to convert measured on-line  $\Delta C$  values back to dry weights, etc.

Figure 1.6 illustrates a  $\beta$ -dispersion showing what one might actually see because of the presence of electrode artefacts (electrode polarization, see later) which can cause the capacitance to tip up at low frequencies. In single-frequency biomass measurements, one selects a single frequency well onto the low-frequency plateau of the  $\beta$ -dispersion (f-low, typically 0.3 to 0.5 MHz) but above the frequency range in which the time-dependent electrode polarization effects cause significant interference. Prior to inoculation, one backs the capacitance of the medium at this frequency to zero, in effect backing  $C_{\infty}$  to zero. During cell growth, the  $\Delta C$  of the  $\beta$ -dispersion increases as the biomass content does and so does the estimate of  $\Delta C$  recorded at f-low.

Also shown on Figure 1.6 is a spot-frequency (f-high) on the high-frequency plateau of the  $\beta$ -dispersion (typically at 10 MHz). The capacitance at f-high is

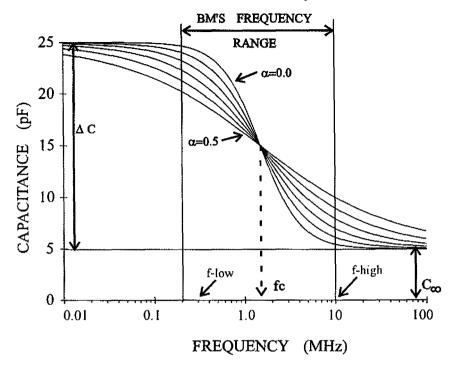


Figure 1.7. The effect of increasing the Cole-Cole  $\alpha$  of the  $\beta$ -dispersion seen within the BM's frequency range. The plots are for a  $\beta$ -dispersion with  $\Delta C = 20$  pF,  $f_c = 1.5$  MHz,  $C_x$  5 pF and in ascending order are  $\alpha$  values of 0.0, 0.1, 0.2, 0.3, 0.4 and 0.5 respectively. It can be seen that as the  $\alpha$  value increases, the spot measuring frequencies are progressively off the plateaux. At very high Cole-Cole  $\alpha$  values, the  $\beta$ -dispersion can fail to reach either of its plateaux within the BM's available frequency range; this can therefore reduce the quality of biomass measurements.

approximately equal to  $C_x$ , whilst that at f-low approximately equals  $(C_x + \Delta C)$ . Thus, if the capacitance is measured simultaneously at f-low and f-high and the capacitance at f-high  $(C_x)$  is subtracted from that at f-low  $(C_x + \Delta C)$ , one is left with  $\Delta C$  and therefore an estimate of biomass. This is the method referred to as dual-frequency biomass measurement.

Both the single- and dual-frequency methods of biomass measurement using the Biomass Monitor have been used successfully with a variety of cells and fermentation configurations. The dual-frequency method offers greater stability to long-term instrumental drift (Davey, 1993a) which can occur during long-term installations.

Leaving aside electrode polarization, which will be discussed later, both these methods do have potential problems because of the need to be well onto the plateaux of the  $\beta$ -dispersion. Figure 1.7 shows the effects of non-zero Cole-Cole  $\alpha$  values on a  $\beta$ -dispersion when seen over the limited frequency range of a BM. As the  $\alpha$  value increases, the spot measuring frequencies are progressively off the plateaux, so reducing the quality of the biomass measurements.

Using spot-frequencies off the plateaux makes the measurements prone to a second source of error, namely 'f<sub>c</sub>-offset' effects. *Figure 1.8* shows three dispersions (lines (A), (B) and (C)) where we have attempted to estimate  $\Delta C$  (and hence biomass concentration) with f-low values on or off the low-frequency plateau. The three lines

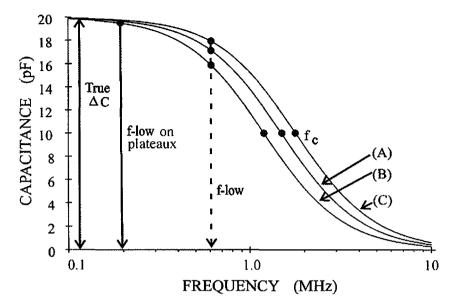


Figure 1.8. The effect on biomass measurements resulting from the movement of the  $\beta$ -dispersion's  $f_{\zeta}$  when the f-low frequency used to estimate  $\Delta C$  is on and off the low-frequency plateau of the  $\beta$ -dispersion. Line (A) shows the capacitance versus frequency plot for a hypothetical cell suspension at a given  $f_{\zeta}$  value. In line (B) the  $f_{\zeta}$  has moved to a lower frequency and this has resulted in an artefactual decrease in the estimate of  $\Delta C$  and hence biomass concentration estimated with the f-low off the plateau but not for the one on the plateau. Line (C) shows the effect of the  $f_{\zeta}$  moving to a higher frequency than that of line (A). This time there is an artefactual increase in the biomass estimated using the f-low off the plateau. Once again, using an f-low on the plateau prevents this artefact from occurring. These artefactual changes in the estimation of  $\Delta C$  (and hence biomass concentration) due to changes in  $f_{\zeta}$  are called ' $f_{\zeta}$ -offset' errors.

are exactly the same dispersion, the only difference being that the  $f_c$  has moved due to gross changes in suspending medium conductivity ( $\sigma_o$ ). Equation 1.5 shows that a fall in  $\sigma_o$  will lower the  $f_c$  (line (B) on Figure 1.8), a rise will increase the  $f_c$  (line (C) on Figure 1.8). With an f-low well onto the low-frequency plateau, these movements have little effect on the estimation of  $\Delta C$ . However, for an f-low off the plateau, movements in  $f_c$  have caused changes in the estimate of  $\Delta C$  and hence biomass concentration, where no such changes have actually occurred. This effect is only a problem for cell suspensions where the medium conductivity is very low (compared to  $\sigma_i$ ) and where large medium conductivity shifts occur during a fermentation. These conditions do not occur in normal industrial fermentations where nutrient levels are high.

The third method that has been used to estimate biomass is by scanning the frequencies over the  $\beta$ -dispersion region to generate a capacitance curve similar to that in *Figure 1.3*. One then fits this curve to the Cole-Cole equation, which models the shape of a dispersion, to give best fit values of  $\Delta C$ ,  $f_c$ , Cole-Cole  $\alpha$  and  $C_x$ . This approach has been used for the non-contact electrode method from Hewlett-Packard (Asami *et al.*, 1996; Siano, 1996) and with the Biomass Monitor (Davey *et al.*, 1993b; Davey and Kell, 1998b). On the BM, one typically scans between 15 and 50 frequencies in random order under the control of an external computer. Curve fitting of the data is then undertaken on the computer with a program that uses the

Levenberg/Marquardt algorithm for non-linear least-squares fitting (Marquardt, 1963; Bevington, 1969; Grant et al., 1978; Press et al., 1990; Davey et al., 1993a). For noisy data, the influence of outlying points is minimized using 'robust weighting' (Mosteller and Tukey, 1977; Leatherbarrow, 1992).

The main advantage of frequency scanning is that one can extrapolate to the plateaux of the  $\beta$ -dispersion if they are outside the frequency range of the instrument and so  $f_c$ -offset errors are eliminated, as are the adverse effects of large Cole-Cole  $\alpha$  values (see above). On the down side, scanning can take from several seconds to several minutes, which can cause problems in rapidly changing systems, eg ones where gas hold-up fluctuates rapidly or where there is poor mixing or homogeneity. The computational overheads in the curve fitting procedure and the need to check that the resulting fits are indeed plausible also need to be taken into consideration for real industrial applications.

### ELECTRODE POLARIZATION

The major limiting factor on the performance of dielectric biomass estimation for systems where the electrode metal is in direct contact with the growth media is electrode polarization. The charged metal electrodes used to apply the electric field to the cell suspensions attract a counter layer of ions around themselves which act as a large capacitance in series with the suspension of interest (Schwan, 1963; Bockris and Reddy, 1970). This manifests itself in frequency scans as a sharp increase in capacitance in the frequency range where one wishes to measure biomass (ie below about 100–500 kHz) (see *Figure 1.6*). As this polarization capacitance increases as the electrodes become fouled or as the medium conductivity increases, one can see that electrode polarization could be a limiting factor in the present applications of capacitive biomass measurements (Cerckel *et al.*, 1993; Degouys *et al.*, 1993; Siano, 1996; Davey and Kell, 1998a,b).

A variety of methods have been used in order to remove the polarization's contribution to biological spectra with varying degrees of practicality (Davey and Kell, 1998b). The Biomass Monitor uses a four-terminal electrode design using 'non-polarizable' platinum electrode pins to reduce the innate polarization of the electrodes (Schwan, 1963; Schwan, 1968; Schwan and Ferris, 1968; Ferris, 1974; Harris *et al.*, 1987; Kell, 1987a; Kell and Davey, 1990). This arrangement consists of two pairs of electrodes, the outer two apply an alternating current at a suitable frequency in the range of 0.2 MHz–10 MHz (from 0.1 MHz on older machines), while the inner two, which are connected across the terminals of a high impedance voltmeter, pick up the alternating potential difference (Kell and Woodward, 1991). With a high input impedance voltmeter, negligible current crosses the electrode interface, and hence polarization is reduced. In practice, this configuration works well (Kell and Davey, 1990; Davey *et al.*, 1997), but it does not remove all of the polarization. This is particularly evident at high conductances combined with low biomass (Cerckel *et al.*, 1993).

In addition to its electrode design, the BM uses electrolytic cleaning pulses to keep the electrodes clean and to reduce electrode polarization. 10 V pulses are applied to the electrodes which generates gas bubbles by electrolysis that lifts off any adhering materials and also exposes fresh, uncontaminated metal. Both these factors serve to

keep the polarization of the electrodes low in the vast majority of fermentations. However, if the protein content of the medium is very high, as in some brewery worts or animal cell media containing albumin, the pulses can actually precipitate the protein onto the electrodes (Yardley *et al.*, 2000).

For situations where polarization is still a problem on the BM, two methods have been devised to reduce its influence: the polarization control method and the 2f method. The polarization control method (Schwan, 1963; Grant et al., 1978; Davey et al., 1990) is frequently used as an off-line method using the Biomass Monitor. A frequency scan of the cell suspension is performed and the conductance at the lowest frequency noted. A sample of the suspending medium is then taken and its conductance adjusted at the lowest frequency to that of the suspension using either distilled water or solid KCl. When this solution is scanned, we have an estimate of the polarization as a function of frequency that can be subtracted from the cell suspension scan to provide data that is largely free from polarization.

The 2-frequency (2f) method (Davey and Kell, 1998a,b) for reducing electrode polarization on BM dielectric spectra has recently been developed. Electrode polarization can be modelled by a power law and the parameters of this model can be simply modified to give reliable and intuitive measures of the magnitude ( $^{L}C_{p}$ ) and the rate of fall of polarization with increasing frequency ( $^{h}f$ ). Although the magnitude of electrode polarization can change, it was found that the  $^{h}f$  value remained constant. This latter fact enabled the capacitance of a suspension at two frequencies to be used to estimate the polarization's contribution to the spectra and then eliminate it from the suspension data. This method is on-line and is easily capable of being put under full computer control. Where this is of particular use is where the  $\beta$ -dispersion curve has become embedded in a large polarization curve due to low biomass concentration and a highly conductive growth medium.

A recent and highly significant electrode development involves inductively coupled electrodes based on the use of magnetic fields (Asami et al., 1996; Siano, 1996). This removes the need for any direct electrode/suspension contact and so eliminates electrode polarization completely. The probe consists of two coaxial toroidal coils covered with epoxy resin. When an alternating voltage is applied to one toroidal coil, a current that depends on the sample impedance is induced in the other coil by electromagnetic induction. The sample impedance is determined from the relationship between the output current and the input voltage. These electrodes have been prototyped by Siano (1996) and have been marketed by Hewlett Packard as the Colloid Probe. Recent studies using this instrument include those of Asami and Yonezawa (1995) and Asami et al. (1996).

## DIELECTRIC SPECTROMETER BASELINE ARTEFACTS

The baselines of the spectra obtained with dielectric spectrometers (eg a BM) are typically not flat as a function of frequency, by virtue of the fact that one is operating at radio frequencies where strays become increasingly important as one ventures above 1 MHz. Thus, most dielectric biomass measurement systems rely on calibration/compensation methods to generate reliable data (eg Siano, 1996). For instance, in the BM there are electronic compensations in the machine itself. This has recently been complemented by a full mathematical model of the baseline artefacts of the

machine as functions of both frequency and growth medium conductance, which can be implemented in software (Yardley et al., 2000).

## Biomass measurements on model systems using instruments other than the Biomass Monitor

There are several other types of commercial, commercially based or experimental instruments for making capacitative biomass measurements apart from the BM. All these instruments involve using/augmenting the features of existing analysers such as those produced by Hewlett-Packard. However, none of these systems is as yet ready to be used as an 'off-the-peg' biomass instrument in real industrial environments and all the published research has been on model laboratory systems.

Researchers from Kobe Steel Limited have developed a capacitance probe based upon a Yokogawa Hewlett-Packard 4194A Impedance/Gain Phase Analyser controlled with a NEC PC9801 (Mishima et al., 1991a; Mishima et al., 1991b), These researchers investigated both immersible and installed electrode arrangements (Junker et al., 1994). The distance between the platinum blacked electrodes employed using the immersible system was approximately 30 mm; however, it was notably greater for the installed platinized platinum plate electrodes placed on opposite sides of a 10 litre fermentor. A wide variety of cell types were studied in order to examine the suitability of the combination of the measuring instrument and the electrodes for biomass determination. These cell types were Saccharomyces cerevisiae (as a suspension or immobilized on calcium alginate beads), Escherichia coli (suspension), Aspergillus niger (suspension), human leukaemia (K562) cells (suspension), Madin-Darby bovine kidney (MDBK) cells (microcarrier suspension) and Sesamum indicum L. (plant cells in suspension). The effects of chemical (glucose concentration, salinity and pH) and physical parameters (aeration and agitation) upon the dielectric measurements were assessed. There was an excellent linear relationship between capacitance and cell concentration for all these cell types, even when the physical and chemical parameters mentioned above were varied. Further, it was shown that the capacitance signal reflected biomass as opposed to necromass.

Bragos et al. (1998) used the HP4192A impedance analyser to measure the biomass of Saccharomyces cerevisiae and Candida rugosa (measured on-line) and two bacteria, Escherichia coli and Rhodobacter capsulata (measured off-line). S. cerevisiae was also measured off-line. Liposome suspensions were measured in order to validate the method and to determine the relationship between particle size and the estimation sensitivity (Gamez et al., 1996). Two numerical models of biomass estimation were used, the first using two frequencies derived from the Resistor/Capacitor (RC) model of a generic cell suspension and the dependence of its parameters on the cell volume fraction (P) as described by Foster and Schwan (1989), and the second using the parameters of the Cole-Cole impedance model (Cole and Cole, 1941). In order to reduce artefacts (caused by electrode polarization and cabling), the analyser was connected to the electrodes through a remote front end (Gersing, 1991). This was used in conjunction with a triple reference calibration method adapted from the methodology of Bolk (1985). This work concluded that the off-line results showed a detection threshold, linearity and sensitivity.

Yelamos et al. (1998) have further developed the use of a front-end to reduce the

effects of electrode polarization when again used in conjunction with an HP4192A. They used a modified front-end from that of Bragos et al. (1996), using a common-mode feedback voltage and a high input impedance instrumentation amplifier. From this work, it was found that the low-frequency systematic error due to the instability of the electrodes was cancelled out, as well as the error induced as common mode by interference.

There is a recent, commercially available instrument based upon electromagnetic induction. It consists of a Hewlett-Packard E5050A Colloid Dielectric Probe (described above), a 4285A precision LCR meter and a personal computer (H.P. Vectra), and is capable of measuring within the frequency range of 100 kHz to 20 MHz (Asami and Yonezawa, 1995; Asami *et al.*, 1996; Siano, 1996).

Siano (1996) used the Colloid Dielectric Probe with data acquisition from 75 kHz to 30 MHz to measure the biomass of suspensions of aerated and agitated *Escherichia coli*, *Saccharomyces cerevisiae*, hybridoma cells, Chinese Hamster Ovary and two unnamed proprietary cell lines. Both fixed frequency and spectral permittivity data analysis were compared. For the cells measured, the results indicated accurate and reliable biomass estimations, interference was negligible, there was good linearity and the detection limit was below the inoculation concentration. The cell constants used in this arrangement are some three orders of magnitude greater than those used in the BM, and so the capacitances measured tend to fall in the (femto) fF rather than the pF range.

# Biomass measurements on model systems and real world industrial applications using the Biomass Monitor

## REQUIREMENTS FOR AN INDUSTRIAL BIOMASS MONITORING INSTRUMENT

As we have emphasized the distinction between instruments capable of measuring biomass in laboratory model systems and those capable of being used in industry, it is worth exploring the requirements for true 'off-the-peg' industrial biomass instruments. The major design consideration for an instrument capable of real industrial work is that industrial fermentation halls can be extremely hostile environments. This means that the whole system must be robust to things such as water and steam, personnel climbing on the equipment and large sudden ambient temperature changes. Under these conditions, the machine must be able to operate in a stable manner for prolonged periods without the electrode being removed from the fermentor. As fermentation halls can be extremely large, one must design the system so that the measuring electronics can be at some distance from the electrodes, and multiplexing to multiple fermentors should also be possible. The measuring system must be designed so that no modifications to the user's fermentors are required; thus its probes must fit standard fermentor ports. Any calibrations required must be infrequent and simple, and the electrical output of the data has to be compatible with industrial fermentor monitoring systems.

The design of the electrodes is critical. The system should not be overly susceptible to electrode polarization, and there should be an *in situ* cleaning system to prevent growth on the electrodes themselves. The construction materials used must be inert and the electrode construction has to be robust. It must be able to withstand high

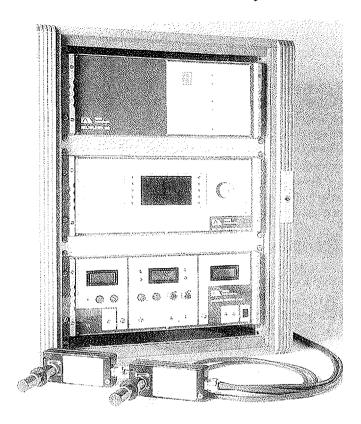


Figure 1.9. A Biomass Monitor system contained in a waterproof housing (background) suitable for an industrial installation. The system consists of a Biomass Monitor (bottom) linked to a Muliplexer Controller (middle) and a Multiplexer (top). For clarity, only two probes and cabling are shown connected to the system (foreground). The probes fit into standard 25 mm fermentor ports and are screwed into head amplifiers (small boxes) that do some signal conditioning prior to passing the measured signal to the main BM units.

pressures and repeated *in situ* chemical/heat sterilization and, above all, must not present a microbial contamination risk. The Biomass Monitor has evolved over the past decade to fulfil all of the above requirements (see *Figure 1.9*) (Davey *et al.*, 1999).

In the sections that follow, various applications of the BM are described, with particular emphasis on the more demanding systems and on real world industrial applications of the machine.

#### ASSESSMENT OF CYTOTOXICITY

The major site of cytotoxic action of organic solvents is the cytoplasmic membranes of cells (Tanford, 1980), due to the hydrophobicity or amphipathicity of such molecules and their ability to partition into, and to dissolve, such membranes (Seeman, 1972). Therefore, a screen based on the assessment of membrane damage is indicated.

Stoicheva et al. (1989) noted the effects of octanol upon the  $\beta$ -dispersion of S. cerevisiae. As this partitioned into the plasma membranes, it first caused an increase in capacitance due to the expansion of membrane area (Seeman, 1972), which was followed by a rapid decrease due to cell lysis. This effect held for a number of other substances tested. The work of Salter and Kell (1992) confirmed that cell membrane damage is the likeliest major mechanism of toxicity, and that it was readily assessable using the Biomass Monitor. Davey et al. (1993b) noted a reduction in cell 'viability' after solvent exposure, according to the methylene blue and ethidium bromide tests. This emphasizes the fact that biomass rather than necromass is detected using dielectric measurements. From this work, it was concluded that the dielectric approach was a novel and convenient means by which to screen solvents, and indeed substrates, for their biocompatibility. These works and others are included in the recent review of solvent effects on microbial cells by Salter and Kell (1995).

### BACTERIA AND BIOFILMS

The formation of biofilms can be measured using dielectric spectroscopy as an on-line method. Markx and Kell (1990) observed the formation of a biofilm caused by *Klebsiella rubiacearum*. The biofilm was grown in a plate system under a constant flow of medium with the tip of a BM probe flush to the plate wall. Dielectric measurements were recorded on the Biomass Monitor by registering capacitative changes of the culture in the frequency range 0.1 MHz-10 MHz using a 4-terminal gold electrode. It was shown that the biofilms could be removed from the probe by using the Biomass Monitor's electrolytic cleaning pulses. A number of biocides were assessed, including cetrimide, chlorine and glutaraldehyde. Chlorine both removed and inhibited further biofilm formation and it was also demonstrated that the automated addition of chlorine in response to changes in capacitance allowed for the control of biofilm formation on-line.

### FILAMENTOUS BACTERIA AND FUNGI

Fehrenbach et al. (1992) decided that the Biomass Monitor had reached a stage of development where it could be installed in pharmaceutical production facilities working to cGLP/cGMP regulations. Their work was performed on three scales, with 20 litre, 1,500 litre and 2,000 litre total bioreactor volumes. They used Saccharomyces cerevisiae, Pitchia pastoris and Streptomyces virginiae for biomass estimations in suspension culture. It was concluded that the Biomass Monitor gave an on-line capacitance measurement that could be related directly to biomass concentration. The instrument was also particularly useful in following mycelial growth under industrial conditions, for which precise off-line measurements did not exist. Under these circumstances, the instrument gave data which were closer to physiological reality and could be interpreted more readily and easily than the traditional off-line methods.

Saccharopolyspora erythraea was grown in submerged culture at 2 agitation speeds by Sarra et al. (1996) on a soluble medium with glucose as the main carbon source. They concluded that the BM gave good agreement during the growth phase when compared with biomass concentrations as determined by dry weight methods, and that the Biomass Monitor was unaffected by mycelial fragmentation and a lowering of viscosity.

### SOLID SUBSTRATE FERMENTATIONS OF FILAMENTOUS FUNGI

The direct measurement of microbial biomass on-line and in real-time in liquid substrate fermentations has been problematical, and in solid substrate fermentations virtually impossible. Davey *et al.* (1991) showed it was possible to exploit the dielectric properties of cells in order to overcome this problem using the accretion of tempe as a biological model (*Figure 1.10*).

Solid-substrate fermentation processes using moulds are traditionally exploited in the manufacture of a wide variety of oriental foods including tempe. Tempe is a typical example of a solid-substrate fermentation and is traditionally a soya bean product fermented by the filamentous fungus *Rhizopus oligosporus* Saito. The tempe was cultured at 31°C in petri dishes using soya beans, Andean bitter lupins (*Lupinus mutabilis* Sweet) and Quinoa seeds (*Chenopodium quinoa* Willd) as substrates. The Biomass Monitor electrode was introduced centrally through the perforated lid of a petri dish into the culture, with the electrodes and probe body penetrating 3–7 mm into the substrate. Fermentations were followed over a period of five days and samples were taken from replicate dishes in order to monitor the culture's pH, moisture content and biomass as hyphal length per gram dry weight. It was shown that capacitance and hyphal length during the growth phase were closely related, with the linear regression correlation coefficients being close to unity. In this case, capacitance was proven to be a reliable, reproducible and on-line measurement of biomass in solid substrate fermentations.

Peñaloza et al. (1991) exploited dielectric spectroscopy in order to identify the

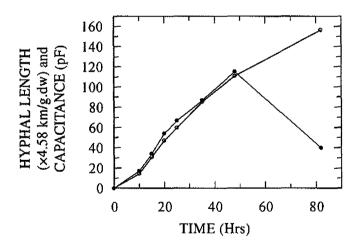


Figure 1.10. The growth of the filamentous fungus *Rhizopus oligosporus* on soya beans during the solid substrate tempe fermentation. For details of the methods used see Davey *et al.* (1991). This figure compares the variation of hyphal growth in km of hyphae per gram of dried tempe (open circles) with capacitance (pF) (closed circles) over the course of the fermentation. The capacitance data were recorded continuously, online and in real-time using a BM but only the data points corresponding to the off-line hyphal length throughout the 48 hour growing period. During the lytic phase, the body of the tempe collapses away from the beans as the cells lyse. The loss of intact membranes causes the capacitance to fall while hyphal length remains unchanged, as this is based on the measurement of the unaffected cell walls.

effects of potassium on the growth of *Rhizopus oligosporus* in solid substrate fermentations. The sources of potassium were  $K_2CO_3$ ,  $K_2HPO_4$ , and KCl, and were introduced to the culture medium at known concentrations. Mycelial potassium salt levels were measured using an Auto Analyser and capacitance readings recorded using a Biomass Monitor at a fixed single frequency of 0.3 MHz. It was concluded that the online measurement of fungal biomass via capacitance was extremely useful in determining the effect of potassium ions on mycelial growth, and led to a significant improvement in both the medium composition and the speed of the fermentation.

Further to this work, Peñaloza *et al.* (1992) used the Biomass Monitor at a single set frequency of 0.3 MHz to optimize the solid-substrate tempe fermentation of *Chenopodium quinoa* Willd by *Rhizopus oligosporus* Saito. From the accurate determination of biomass via capacitance, the optimum combination of strain and fermentation conditions were deduced for tempe production. This consisted of an initial moisture content of some 620 g.kg<sup>-1</sup>, an initial pH of 6.4, and an inoculum of  $3 \times 10^4$  colony-forming units of strain UCW-FF8001 per gram of substrate.

### YEAST

## **Fermentations**

The dielectric properties of yeast cell suspensions have been studied in great depth both on- and off-line by many authors (eg Asami and Yonezawa, 1996; Harris et al., 1987; Kell, 1987b; Kell et al., 1987; Davey et al., 1992; Asami et al., 1999). In fact, yeast provides the standard models for studying the dielectric properties of cells in general, and for dielectric biomass measurement studies in particular. Indeed, the first Biomass Monitor publication (Harris et al., 1987) was on studies of yeast growing in an airlift fermentor (Figure 1.11 a and b). Leading on from this work, further research has led to other yeast studies and applications.

Salter *et al.* (1990) described a novel method of yeast cell immobilization in ceramic microspheres that allowed high cell densities to be achieved. A suspension of *S. cerevisiae* was passed through a column of microspheres into which a BM electrode had been built. The cells rapidly colonized the microspheres with an even distribution along the entire column length. Cell loading was determined off-line using a protein assay and optical density. From this it was possible to correlate the measured capacitance from the Biomass Monitor to the column loading. The conversion factors produced were 1 mg dry wt.ml<sup>-1</sup> =  $39.6 \times 10^6$  cells.ml<sup>-1</sup> = 1.74(6) pF. Overall, the Biomass Monitor proved to be very reliable, irrespective of whether the cells were resting or growing.

Kronlof (1990) monitored immobilized yeast cells in a continuous brewery fermentation that, due to the insoluble nature of the carrier, can cause problems for the more traditional approaches to viable biomass monitoring. The problems are associated with the complete inhabitation of the immobilization system and how to ensure the complete removal of adhering cells. Further, when the cells had been removed it was unclear as to how to differentiate between viable and non-viable cells, as this is impossible when using traditional protein estimation methods to calculate biomass. Several biomass determination methods were evaluated: gravimetric, haemocytometer, methylene blue, ATP determination and glycogen estimation. The results were

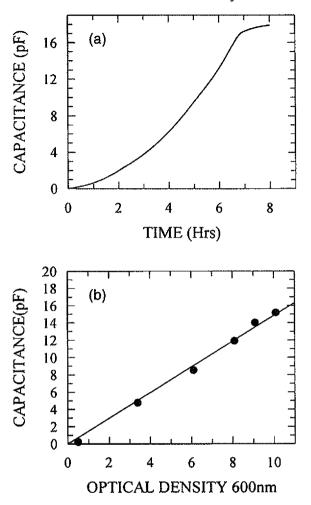


Figure 1.11. The growth of yeast in an air-lift fermentor (see Harris *et al.* (1987) for full details of the methods used). (a) The on-line real-time estimation of biomass using a BM. The capacitance of the suspension was measured at 0.3 MHz using single-frequency biomass measurements. (b) The data from (a) plotted against the equivalent off-line optical densities (after appropriate dilution) measured at 600 nm. An almost perfect linear relationship between the two methods of accessing biomass is demonstrated.

compared to those obtained from the Biomass Monitor. It was found that the background effect due to non-cellular material could be eliminated and a wide range of biomass concentrations reliably monitored. The conclusion was that the Biomass Monitor is equally suitable for viable biomass estimations in both suspended and immobilized systems.

The Biomass Monitor has also found a significant niche in fermentation process control (Kronlof, 1990; Kronlof, 1991; Markx et al., 1991b; Austin et al., 1994; Davey et al., 1996). Markx et al. (1991b) grew baker's yeast in a novel type of turbidostat, or more correctly permittistat, in which a constant biomass level was continuously maintained by a feedback mechanism based upon the dielectric permittivity of the culture. Dielectric biomass estimations were made using the two-frequency

method at 0.4 MHz and 9.5 MHz. Other parameters were also compared to the permittivity data at each setpoint to validate the fermentor control. These included dry weight, fresh weight, the optical density at 600 nm, percentage viability (from the methylene blue assay), bud count, ethanol concentration, glucose concentration, and the cell size distribution was measured using flow cytometry. Good linear relationships between setpoint permittivity and dry weight, wet weight and OD were obtained. It was concluded that any changes in the physiological properties of the yeast had a negligible effect on the ratios between permittivity set (and measured) and the steady-state dry weight or optical density of the cultures.

Davey et al. (1996) studied the fluctuations in growth rate of a permittistatically controlled yeast culture as estimated from the rate at which medium was pumped into the fermentor to maintain the permittivity setpoint (biomass concentration). They found that permittistatic control provided an excellent method of maintaining and monitoring a constant biomass level within a fermentor and were the first to show that cellular growth could exhibit deterministic chaos.

A study by Austin *et al.* (1994) utilized the Biomass Monitor in a control loop to maintain set-point levels in a cyclic reactor under perturbations. A linear relationship was found between capacitance measurements and cell counts of brewer's yeast suspensions and, importantly, a correlation was also demonstrated between capacitance and viable biomass concentration.

## Brewery yeast management

Yeast management within breweries has received a considerable amount of attention in recent years. It is necessary to ensure that there is the correct amount of yeast in the wort at the start of a fermentation as this has a major influence on the final quality of the beer. A great deal of research has been undertaken to assess practical ways in which yeast concentration can be monitored prior to and during pitching (Carvell, 1994). Traditionally, yeast pitching rate is calculated from either the direct weighing of yeast cake or, more usually, by metering a volume of yeast slurry with a predetermined solids content. Both methods have disadvantages and these may lead to errors in calculating the correct quantity of yeast in the pitch. The yeast cake method is prone to errors due to variable moisture levels and the spun solids content can be inaccurate at high concentrations. With the yeast slurry method, it is necessary to correct the yeast content for trub (insoluble non-yeast material) and yeast viability by off-line methods. These problems make process automation difficult.

Viability is a measurement that has vexed brewers for many years. Viable and non-viable yeast cells can purportedly be discriminated using the methylene blue staining method (Fraser, 1920), which is still widely considered to be the standard. In addition to the question of membrane permeability, metabolically active cells reduce those molecules of methylene blue which do cross the cell membrane to a colourless form. The methylene blue method is a subjective test that tends to overestimate the number of viable (culturable) cells (since metabolic activity can remain long after culturability is lost; Davey et al., 1996; Barer et al., 1998; Kell et al., 1998). Even after viability staining, the production brewer may well add approximately 10% extra yeast 'in order to be on the safe side'. This addition can lead to fermentation problems, as over-pitching can be the cause of poor yeast

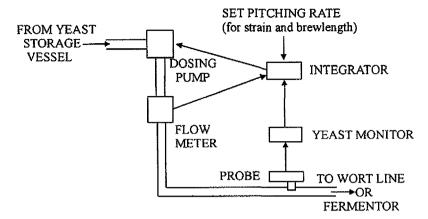


Figure 1.12. A schematic diagram of an automated pitching rate control system incorporating a Yeast Monitor to ensure an accurate amount of viable yeast slurry is delivered from a yeast storage vessel to the fermentor. The brewer sets the amount of yeast to be pitched and the timing of the pitch within the brew. The system then monitors the concentration of viable yeast passing the probe in the pitching main. The resulting concentration signal is then integrated with the output from the flow meter, giving a measure of the amount of viable yeast pitched into the fermentor. When the target is reached, the controller will turn off the yeast pump. With the addition of a flow meter in the wort line, the wort flow can be used to control the viable yeast rate and hence provide continuous pitching over the entire length of the brew (Carvell, 1997).

vitality, reduced hop utilization, and variable consistency in terms of product flavour and process optimization.

For the purposes of estimating on-line viability of yeast, the 316B Yeast Monitor was developed from the BM specifically for the brewing industry. The Yeast Monitor is capable of measuring the viable yeast count per ml directly on-line and is unaffected by trub, proteins or gas bubbles. The 316B was evaluated by a major British brewing company (Bass Brewery PLC, High Street, Burton-on-Trent, Staffordshire DE14 1JZ, U.K.) and their results were presented at the 22<sup>nd</sup> European Brewing Convention (Boulton et al., 1989). The results in that paper showed a linear relationship between capacitance and yeast biomass over a range extending to at least 50% wet weight/ volume which was equivalent to 100 mg.ml<sup>-1</sup> dry weight or 1 × 10<sup>9</sup> cells.ml<sup>-1</sup>. It was also noted that, with the correct yeast pitch as determined by the Yeast Monitor, a typical fermentation was completed in 55 hours as opposed to the periods of up to 74 hours occasioned by conventional pitching procedures. These correct pitching values in turn led to enhanced fermentor performance, and therefore to an increased turnover. In this paper, a schematic representation of a yeast pitching control system was also suggested (Figure 1.12), which was later implemented in the breweries of many companies worldwide. Leading on from this article, the application of the Yeast Monitor to control yeast pitching rates received further attention: Boulton et al., 1991; Lawrence, 1992; Boulton and Clutterbuck, 1993; Maca et al., 1994; Kell and Todd, 1998.

In the study of Maca et al. (1994), Yeast Monitor readings were used to calculate the yeast slurry volumes required to pitch fermentations at the Miller Brewing Company, Milwaukee, U.S.A. These volumes were then compared to a conventional spin down wet solids measurement method of calculating pitching rates. This method gives an estimate of the yeast volume to be pitched based upon the determination of

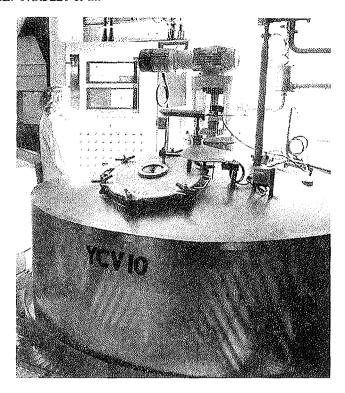


Figure 1.13. This photograph shows a Yeast Monitor (background) installed in a working brewery environment (Bass PLC, U.K.). This system utilizes the Yeast Monitor to automatically control yeast cropping, thereby ensuring that waste is minimized and the storage of viable yeast suitable for re-pitching, is maximized.

the volumes of specific layers within a centrifuged sample of yeast. Of six fermentors pitched using the Yeast Monitor, all were on target for viable cell count immediately after pitching. In comparison, only one out of the five fermentors that were pitched using the traditional spin down method was on target. It was also concluded that the Yeast Monitor is not affected by the high and varying levels of trub which, in the Miller yeast, can interfere with the spin down method.

During 1993, Alfa Laval Brewery Systems, Sweden, launched the Dynapitch controlled yeast pitching system, which at its heart is controlled by a 316B Yeast Monitor. This instrument was evaluated by Dymond *et al.* (1994) and is a self-contained, skid-mounted, computer-controlled module designed to minimize the requirements for on-site engineering and installation. The system is currently installed in a number of European breweries, allowing the full automation of yeast pitching.

The Yeast Monitor has recently undergone further metamorphoses. One of the new variants is the Yeast Monitor 320, which utilizes probes positioned at different heights within a large production fermentor (Carvell, 1997). This instrument is multiplexed (up to 16 probes) and designed to monitor yeast profiles and mixing patterns within production fermentors, a process that is not well understood. Further development work by Aber Instruments has led to the 800 series Lab Yeast Analyser

(Pateman, 1997), which has been designed as a bench-top brewery laboratory tool requiring little sample preparation.

A further application of the Yeast Monitor is the control of yeast feed rate to centrifugal separators in breweries. This process can be difficult to optimize, leading to yeast slurries of varying concentration which can cause centrifuge blockages and hence process down time. The combined use of the Yeast Monitor coupled to a variable-speed centrifuge allows the brewer to recover beer from the yeast slurry more efficiently and reliably, with lower running costs. Centrifugation is but one process in the recovery of yeast from the fermentation process (yeast cropping). Yeast cropping can also be automated using a Yeast Monitor so that, among other things, only viable yeast is stored ready for re-pitching (Figure 1.13) (Boulton and Clutterbuck, 1993; Carvell, 1997; Siems, 1997).

#### ANIMAL CELLS

Biotechnological processes performed at a semi-pilot or industrial scale using mammalian cells lack appropriate probes to evaluate on-line, in real-time, non-invasively and reliably, the biomass content of a bioreactor (Kell *et al.*, 1990; Konstantinov *et al.*, 1994).

The application of the Biomass Monitor to animal cell culture monitoring has only occurred in earnest in the last few years (Cerkel et al., 1993; Degouys et al., 1993; Beving et al., 1994; Davey et al., 1995; Noll, 1995; Noll et al., 1996; Noll and Biselli, 1998; Davey et al., 1997; Guan and Kemp, 1997; Guan et al., 1998; Zeiser et al., 1999). In these works, the Biomass Monitor has been used to study the growth of a wide variety of animal cells, whether in suspension or in an immobilized state.

Cerckel et al. (1993) investigated the dielectric properties of Chinese Hamster Ovary (CHO 320) cells and HeLa cells grown in suspension culture at a concentration of  $0.5-3 \times 10^6$  cells.ml<sup>-1</sup> and scanned at frequencies between 0.2 and 10 MHz using a BM. Cell numbers were determined using a Coulter Counter model  $Z_h$  and a linear relationship between capacitance and cell number was observed. Low-frequency dielectric spectra did, however, prove to be unreliable due to the high conductance of the growth medium and the corresponding increase in electrode polarization. It was found that using 0.5 MHz as the measuring frequency gave the best compromise in terms of loss of sensitivity versus quality of biomass evaluation.

Zeiser et al. (1999) grew batch suspension cultures of Spodoptera frugiperda Sf-9 (insect cells) which were infected with a baculovirus expressing recombinant β-galactosidase. Permittivity measurements were made on-line using a Biomass Monitor set at a frequency of 0.6 MHz. It was observed that during the growth phase there was an increase in the relative permittivity; this reflected an increase in viable cell numbers that remained broadly matched with permittivity during the time-course of the experiment. From these data, the most appropriate point on the growth curve for the addition of the baculovirus could be determined. The virus initiates the arrest of cell division, and the infected cells increase in size, eventually lysing and releasing the recombinant protein. The use of dielectric spectroscopy allowed for the optimization of the time of infection, and hence led to the maximum yield of the recombinant protein.

Macroporous carriers are a useful means of increasing the numbers of cells in a culture which can be low, particularly in batch cultures using CHO 320 cells (Guan and Kemp, 1997). One of the problems in using macroporous carriers to cultivate animal cells in culture has been to assess cell viability on-line; this is because many of the cells inhabit the macroporous infrastructure of the bead. Guan and Kemp (1997) measured the cell concentration of CHO 320 cells grown on Cytopore 1 microcarrier beads (Pharmacia) using off-line protein estimations and compared them to dielectric measurements made using a BM. The results indicated that the dielectric estimations of biomass in the microcarriers was more accurate than the protein estimations, and was also able to give a viable cell count.

Degouys *et al.* (1993) used the Biomass Monitor to evaluate the concentration of anchorage dependant HTC cells grown on Cytodex 3 (Pharmacia) in spinner vessels. Capacitance values measured at 0.8 MHz on the Biomass Monitor were compared to measurements from a Coulter Counter  $Z_b$ . It was found that the cellular biomass estimations made from the Biomass Monitor were extremely accurate when seeded concentrations of Cytodex of 5 g/L and higher were used. These microcarrier concentrations are those commonly used in the biotechnology industry for the mass production of recombinant anchorage-dependent cells.

Davey et al. (1997) used suspensions of immobilized Chinese Hamster Ovary (CHO 320) cells that had been genetically adapted to produce interferon-γ to evaluate the relationship between capacitance and the concentration of viable cells. Dielectric data were compared with data from a Coulter Counter (Model D) and from flow cytometry, comparisons were also made with traditional microscope counts (haemocytometer) and to the fluorescein diacetate and ethidium bromide viability assay. An excellent relationship was again observed between capacitance and viable cell number. This is important, as the conventional means of assessing biomass are not possible with immobilized cells.

Guan et al. (1998) combined on-line BM and microcalorimetric measurements to control a stirred aerobic batch culture of CHO 320 cells that had been genetically modified to produce human interferon- $\gamma$ . This approach was chosen as cell growth is associated with an enthalpy change which is a direct reflection of metabolic rate. A specific heat flow measurement was achieved by dividing heat flow rate by the capacitance of the cell suspension with detection limits of ca.  $2.0 \times 10^{-6} \,\mathrm{W.cm^{-3}}$  and  $1.4 \times 10^{5} \,\mathrm{cells.cm^{-3}}$  respectively. The results of this work have led to the patenting of a specific heat flow sensor as a means of metabolic control of mammalian cell cultures with the advantages of on-line reliability, robustness, and with long-term advantages in the way of little recurrent cost to the user.

Noll and Biselli (1998) evaluated the BM using immobilized hybridoma cells grown in continuous suspension in a fluidized bed bioreactor batch culture. Both capacitance and conductance were measured on-line at a frequency of 0.6 MHz, while control measurements were made off-line to ascertain cell density. The capacitance data provided information that led to computer optimization of on-line medium dosing as it was found that a constant ratio existed between glutamine consumption and capacitance. This allowed a closed loop control of the medium feed rate, which was directly linked to the capacitative signal produced by the Biomass Monitor during the entire course of a continuous fermentation.

#### PLANT CELLS

Markx et al. (1991c) measured the biomass of plant cell suspensions of Festuca arundinacea using the on-line measurement of the permittivity of the culture with a BM, and also by measuring the conductivity of the suspending medium and the cell suspension as a whole using a 'Bruggeman probe' connected to a bench conductivity meter. The Bruggeman method of biomass estimation (Bruggeman, 1935; Lovitt et al., 1983) proved accurate and could be applied on-line, and it also gave results which correlated with biomass concentrations as determined from measurements of the radio-frequency dielectric permittivity of the culture. However, the Biomass Monitor's results based upon dielectric permittivity were more convenient to use on-line as no mechanical pumping was required, although one has to say that the Bruggeman approach has the potential to form a very cheap biomass measuring system for systems where the cells/immobilized cells settle out very quickly or can be easily filtered.

Further work by Markx et al. (1991d) showed that dielectric spectroscopy using a BM could be used to measure the shear sensitivity of plant cells by measuring the permittivity fall in a plant cell suspension culture under shear stress. This was demonstrated using suspension cultures of Cathararanthus roseus, Nicotiana tabacum, Cinchona robusta and Tabernaemontana divaricata. All of the cultures showed an initial rapid decline in viable cell number, followed by a slower decline as observed dielectrically. These results were compared with fresh weight, dry weight, packed cell volume and cell number. It was concluded that the sensitivity of the cells to shear stress depended strongly on the cell line but only slightly upon the cell's age.

### Conclusions

It is clear from the many publications cited that capacitative (dielectric) biomass measurements are generally an accurate and reliable method of determining viable cellular biomass, both on- and off-line. However, of the several instruments that have been used to make these measurements, it is only the Biomass Monitor and its derivatives that can be used for 'off-the-peg' applications, particularly within an industrial environment.

The Biomass/Yeast Monitor continues to be incorporated and exploited within the brewing and pharmaceutical industries, with its use being not purely for measurement but also as a control instrument, capable of controlling valves, centrifuges, etc. Within the brewing industry, the Yeast Monitor has been utilized in the control of yeast pitching, yeast reclamation, the monitoring of cell growth, and feed rate control for beer recovery processes. The use of the Yeast Monitor has, in some breweries, wholly superseded traditional methods of yeast measurement and has led to greater process performance, with important capital cost savings.

Perhaps the major future advances in dielectric biomass estimation will come with fully developed instruments that can operate below 100 kHz without significant electrode polarization affecting the results. This would not only give more reliable biomass estimations but would allow the study of low-frequency dielectric phenomena related to cell surface charge effects (the  $\alpha$ -dispersion). The extension of dielectric studies from the linear to the non-linear domain has already begun (Woodward and

Kell, 1990; Woodward *et al.*, 1996) and could lead to important new on-line methods of monitoring cell physiology.

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