# **Application of MRI for tissue characterisation of 'Braeburn' apple**

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### 10 Keywords

- 11 internal browning; MRI; apple; Braeburn; tissue; storage
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### 13 Abstract

14 Magnetic resonance imaging (MRI) has become a well-established technique for non-destructive analysis of 15 the internal (micro)structure of food, and the related heat, gas, water and solutes transport therein, which is of 16 interest for food processing (e.g., drying), physical tissue damage assessment (e.g., bruising) for online 17 sorting purposes or detection of internal defects (e.g., internal browning), amongst others. In contrast to 18 previous MRI studies which predominantly analysed entire fruit, small samples (diameter ~  $10^{-2}$  m) of 19 Braeburn apple were investigated in this study with high-field MRI, providing very local, high-resolution 20 information, in order to identify the capability of MRI for detecting differences in fruit tissue types. The 21 focus was on MRI for tissue characterisation with respect to inner and outer cortex tissue, fertilisation 22 treatment, storage time and internal browning (IB). For this purpose, the proton density (PD),  $T_2$  value and 23 self diffusion coefficient (DC) were measured. No clear distinction could be made between samples with 24 different fertilisation treatments. Differences in storage times could be observed from an increased PD for 25 longer storage times. Inner tissue clearly showed an increased PD,  $T_2$  value and DC, compared to the outer

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tissue. IB could be successfully detected, where the PD,  $T_2$  value and the DC of the affected tissue were clearly higher than those of the healthy tissue, but a dependency of these parameters on the degree of tissue degradation was identified. Especially, the DC seemed to be an appropriate parameter regarding IB detection.

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#### 31 **1. Introduction**

32 Knowledge of the internal (micro)structure of fruit, and the related heat, gas, water and solutes transport 33 therein, is of interest for many pre- and postharvest applications. Typical examples are analysis of tissue 34 development during growth, physical tissue damage assessment (e.g., bruising), postharvest treatments to 35 improve fruit quality and shelf life (e.g., heat treatments or storage conditions), food processing (e.g., drying 36 or freezing) and online quality assessment for sorting purposes. Several experimental techniques have been 37 applied for these purposes (Abbott et al., 1997; Falcone et al., 2006), such as X-ray computed tomography 38 (Lammertyn et al., 2003a, 2003b; Verboven et al., 2008; Musse et al., 2010), near infrared spectroscopy 39 (NIR, Clark et al., 2003; Nicolai et al., 2007) or magnetic resonance imaging (MRI, Clark et al., 1997; Hills 40 and Clark, 2003; Lammertyn et al., 2003a, 2003b). MRI has become a well-established technique for the 41 analysis of fruit and other food due to the following features (Clark et al., 1997): (1) MRI is non-intrusive, 42 hence non-destructive, which allows monitoring of intact samples (e.g., fruit) over time; (2) MRI is very 43 suitable for fruit, due to their high water content and the sensitivity of MRI to quality parameters affecting 44 the fruit (e.g., browning); (3) 3-D high spatial resolution information on the internal fruit structure is 45 available (typical slice thickness ~ 100-1000  $\mu$ m; resolution in 2-D slice ~ 10-50  $\mu$ m; voxel volume ~ 10 46 nL); (4) Different parameters related to the microstructure, water distribution and its mobility can be 47 measured (proton density PD,  $T_1$  and  $T_2$  value, self diffusion coefficient), which often provide 48 complementary information; (5) Different substances (e.g., water, oil, sugar) can be distinguished.

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50 For apple fruit in particular, MRI has already been applied to analyse: (1) changes within the tissue during 51 ripening and storage (Letal et al., 2003); (2) internal quality defects such as voids, worm damage or bruising 52 and their variation over time (Chen et al., 1989; McCarthy et al., 1995; Zion et al., 1995); (3) the 3-D

53 vascular structure (MacFall and Johnson, 1994); (4) the microporosity (air volume) of apple (Musse et al., 54 2010); (5) temporal degradation of apples by watercore (Marlow and Loescher, 1984; Wang et al., 1988; Cho et al., 2008), internal browning (Clark and Burmeister, 1999; Gonzalez et al., 2001; Chayaprasert and 55 56 Stroshine, 2005; Cho et al., 2008) or mealiness (Barreiro et al., 2000; Marigheto et al., 2008); (6) drying of 57 apple (McCarthy et al., 1991; Hills and Remigereau, 1997; Nguyen et al., 2006); (7) transport properties and 58 chemical composition of apples (Verstreken et al., 1997; Keener et al., 1999); (8) water compartmentation in 59 apple tissue (Snarr and Van As, 1992). Note that some of these applications used low-field magnetic 60 resonance sensors (Snarr and Van As, 1992; Hills and Remigereau, 1997; Keener et al., 1999; Chayaprasert 61 and Stroshine, 2005; Cho et al., 2008; Marigheto et al., 2008).

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63 A large amount of valuable research has thus already been performed on MRI of apples (and fruit in general) 64 but some aspects can still be explored more in detail. Most of the aforementioned studies applied MRI from 65 the perspective of its non-destructive nature, where MRI is argued to be particularly suitable for monitoring 66 fruit quality over time and detection of internal defects but also for online quality assessment (e.g., on a 67 conveyor belt). Although there is still a long way to go before online MRI can be applied in practice, i.e. 68 cost-effective and at a realistic throughput, research towards this particular application is ongoing (Clark et al., 1997; Chayaprasert and Stroshine, 2005; Cho et al., 2008). Thereby, nearly all studies considered entire 69 70 apples (except Verstreken et al., 1997; Marigheto et al., 2008), by which the entire range of substructures of 71 the apple fruit (vascular bundles, pits, voids near the core, inner and outer cortex tissue) is comprised in the 72 MRI image. Performing MRI at a higher resolution (smaller field of view) could provide more detailed 73 information by a more local assessment of MRI parameters (e.g.,  $T_2$  value). In addition, MRI parameters 74 (e.g., PD or  $T_2$  value) of several of these substructures are often lumped together in the analysis, for example 75 by not differentiating between inner and outer cortex tissue, which induces biasing of the tissue structure 76 variability over the fruit. Also, tissue characteristics which could be detectable with MRI, such as the change 77 of tissue structure with storage time, can become "invisible" in this way. Furthermore, most studies looked at 78 changes in proton density and  $T_2$  (or  $T_1$ ) values to assess quality, but not at the self diffusion coefficient of 79 water.

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81 This study aims at addressing the aforementioned issues on MRI for apple fruit, as not all of them have been 82 considered in detail in previous studies, in order to contribute to the existing knowledge base of MRI 83 research on fruit tissue. These issues mainly concern evaluating which features of fruit tissue can be 84 distinguished additionally with MRI, for example the change of tissue structure with storage time. Such 85 distinctions are of use for several of the applications mentioned in the second paragraph of this section. Note 86 that such characterisations of specific tissues with MRI (e.g. fertilisation) are not all directly of commercial 87 interest, but they can be contribute in future studies to the general understanding of the physiology and 88 metabolism of fruit, which in time can lead to better preharvest and postharvest storage strategies. Small 89 samples are investigated with high-field MRI, providing very local, high-resolution information, in order to 90 obtain more detailed information, compared to when considering an entire fruit. The focus is on tissue 91 characterisation, where inner and outer cortex tissue, different fertilisation types, different storage times and 92 different storage conditions, i.e., for internal browning detection, are considered. For this purpose, the proton 93 density,  $T_2$  value and self diffusion coefficient are measured.

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#### 95 **2. Materials and methods**

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97 2.1. Apple fruit

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99 Apples (*Malus*  $\times$  *domestica* Borkh) cv. Braeburn were used for this study. Two cultivation treatments were 100 applied: optimal fertilisation (treated with 30 kg/hectare calcium nitrate, 20 kg/hectare phosphorus, no 101 potassium) and suboptimal fertilisation (treated with 30 kg/hectare ammonium nitrate, 20 kg/hectare phosphorus, 80 kg/hectare potassium). The fertilisation was applied on March 24<sup>th</sup> 2010. The apples were 102 harvested on October 27<sup>th</sup> 2010, which was considered to be the optimal harvest date for long-term 103 104 commercial storage for Belgium, as determined by the Flanders Centre of Postharvest Technology (VCBT). 105 Afterwards, each type of apple was stored under two types of controlled atmosphere (CA): browning 106 inducing storage conditions (1% O<sub>2</sub>, 5% CO<sub>2</sub>, 1°C), starting on October 29<sup>th</sup>, and optimal storage conditions

(2.5% O<sub>2</sub>, 0.7% CO<sub>2</sub>, 1°C), starting on November 16<sup>th</sup> (3 week delay of CA to prevent browning). These pre-107 and postharvest treatments resulted in four batches of apples, which were labelled GG, BB, GB and BG. The 108 109 first letter indicates the storage conditions and the second indicates the fertilisation type, where G is used for 110 optimal (good) conditions and B for suboptimal (bad) conditions. Two MRI measurements campaigns were performed, namely one month after harvesting (November 23rd - 25th) and four months after harvesting 111 (March 1<sup>st</sup> - March 4<sup>th</sup>). Note that none of the apples used during the first campaign were stored in CA. 112 Instead, after harvest they were all stored for one month at 1°C under normal air conditions, by which these 113 114 apples only differed with respect to fertilisation treatment. Consequently, for the first measurement 115 campaign, only the fertilisation type is indicated in the sample name, i.e., 0G and 0B. As Braeburn is quite 116 susceptible for internal browning (IB), some apples analysed during the second measurement campaign, the 117 BB type in particular, showed IB.

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- 119 2.2. MRI: system, image acquisition and postprocessing
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Proton (<sup>1</sup>H) magnetic resonance images of apple samples were made in a AVIII 500WB nuclear magnetic resonance (NMR) spectrometer (Bruker Biospin, Germany), equipped with a high-field 11.7 T superconducting magnet, a Micro2.5 gradient system (2.5 G/cm/A gradient sensitivity) and a 1H 500 MHz MicWB40 probe with a quadrature birdcage coil of 30 mm inner diameter.

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126 2-D MRI multi-spin echo measurements (16 echoes) were performed on specific slices within the sample. 127 Due to the finite thickness of these slices (~ 1 mm), information on a thin 3-D volume was actually obtained. 128 The resulting MRI signal intensity (*S*) is a function of experimental parameters (echo time  $T_E$  and repetition 129 time  $T_R$ ) and sample-specific parameters (proton density PD,  $T_1$  and  $T_2$  relaxation values) (e.g., Gonzalez et 130 al., 2001):

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$$S = c \cdot PD \left[ 1 - e^{-T_R/T_1} \right] e^{-T_E/T_2}$$
 (1)

where *c* is a constant, characteristic for the NMR spectrometer. Since MRI measurements with different  $T_E$ were performed (multi-spin echo), contrast was provided regarding  $T_2$  values in particular (transverse (spin-

134 spin) relaxation time), i.e.,  $T_2$  weighted images. The signal intensity and the  $T_2$  value distribution over the 135 individual slices were determined by regression analysis on the MRI signal by fitting a two-parameter 136 exponential recovery curve of the signal intensity on the 16 corresponding signal intensity points (echoes) 137 per slice. In principle, the PD is directly proportional to the MRI signal intensity (Clark et al., 1997; 138 Gonzalez et al., 2001), as also assumed in this study. However, this requires that the signal intensity (S) has 139 been corrected for relaxation times since without such a correction, changes in signal intensity (internal 140 variation within sample, or change at a specific location in the sample over time) could be due to changes of 141 PD but also of relaxation times (see Eq.(1), Gonzalez et al., 2001). Such a correction was accounted for in 142 this study for the  $T_2$  value, as the signal intensity was determined by evaluating the fitted two-parameter 143 exponential recovery curve to  $T_E = 0$ . A correction for the  $T_1$  value was not performed as its influence was 144 considered less critical due to the rather large  $T_R$  value. Note that the proton density cannot be directly related 145 to the moisture content without proper calibration (i.e. scaling). Furthermore, the spatially-resolved self 146 diffusion coefficients of water (DC) were also measured for a few samples by a diffusion-weighted spin echo 147 method. The postprocessing was done with Paravision 5.1 software (developed by Bruker Biospin). The 148 relevant experimental characteristics are presented in Table 1.

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150 The PD indicates the amount of protons within the slice volume. Due to the abundance of water in fruit 151 (moisture content of apple  $\approx 80\%$ ), the PD is mainly related to the presence of water, but also solutes (sugars 152 or proteins) contribute. In some cases, other properties, e.g.,  $T_2$  relaxation, can provide better contrast than 153 the PD. Volumes with spins of shorter  $T_2$  relaxation time appear with lower signal intensities in the NMR 154 images.  $T_2$  relaxation is suggested to be caused by fast proton exchange between water and solutes and by 155 diffusion of water protons through internally-generated magnetic field gradients (Hills and Duce, 1990; Duce 156 et al., 1992; Clark et al., 1997). Such magnetic field gradients are caused by magnetic susceptibility 157 differences in inhomogeneous tissue in a magnetic field, e.g., at the interface between air- and liquid-filled 158 pores. These gradients thus depend on air porosity, pore size distribution and the pore shape (surface to 159 volume ratio of pores). The  $T_2$  values thus reflect to some extent the structure and the mobility of the protons, 160 thus of water inside of the tissue. This could be useful to distinguish free water and water bound to/in

between cell walls. The self diffusion coefficient of water relates to the mobility of the water molecules with respect to their Brownian motion. It is thus a measure of the diffusion/movement of the substance in itself. Apart from the PD,  $T_2$  value and DC, which were selected for this study based on previous experiments on fruit, the  $T_1$  value can also be determined from  $T_1$  weighted images. These NMR parameters (PD,  $T_1$  and  $T_2$ values, DC) are commonly reported in MRI studies (Clark et al., 1997). From the MRI data, statistics were calculated of each slice by considering a circular region of interest (ROI) which included nearly the entire sample (cylindrical, see section 2.3). Only the edge zones were not included

170 2.3). Following statistics were calculated for the PD, the  $T_2$  value and the DC: average and standard 171 deviation.

since the tissue cells here were damaged to some extent from the extraction with the cork borer (see section

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173 In addition to the spin echo method, the gradient echo method (GE) was also evaluated at the high magnetic 174 field of 11.7 T. The GE method however did not provide good contrast for Braeburn apples with internal 175 browning disorder, but it provided good contrast for apples with watercore disorder (results not shown). This 176 could be related to the fact that the GE method at high magnetic fields was very sensitive to local 177 susceptibility changes caused by water/air interfaces which reduced the image intensities almost to zero 178 intensity. Therefore, the GE method could not distinguish well the cell-void-cell structure, but it was actually 179 more suitable for watercore detection, due to the more homogeneous gel-like structure in watercore tissue. 180 For low-field MRI with specific settings, the GE method was however found to provide better contrast than 181 the spin echo method to detect bruising (McCarthy et al., 1995).

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183 2.3. Tissue characterisation experiments

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Apple tissues with different characteristics (e.g. IB) were analysed by slicing small cylindrical samples (diameter 25 mm, height  $\pm$  5 mm) from a cylindrical apple core (diameter 25 mm), which was extracted with a cork borer along the apple equator, as shown in Figure 1. Samples were taken from the inner cortex tissue

188	(close to the core) and from the outer cortex tissue (close to the skin). For each measurement, four samples
189	were stacked on one another in a cylindrical test tube, which was mounted in the coil of the NMR
190	spectrometer (inner diameter 30 mm, Figure 2a). MRI was performed on a slice in the centre of each sample
191	(Figure 2b). An overview of the measured samples is presented in Table 2. Note that within a specific
192	sample, distinct heterogeneity could be found for samples which contained IB or vascular bundles, as
193	indicated in section 3.

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195 2.4. Statistical analysis of fertiliser, storage and cortex tissue effects

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197 An analysis of variance (ANOVA) was carried out using SAS software, version 9.2 (SAS Institute Inc.,

198 Cary, NC, USA) to determine significant effects of fertiliser treatment, CA storage conditions and storage

199 time as well as to test differences between inner and outer tissue on the statistics derived from the MRI data.

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### 201 **3. Results and discussion**

202 The influence of fertilisation type, storage time (one month - four months), tissue type (inner or outer) and IB 203 (related to storage conditions) on the MRI data is analysed to see to what extent these features can be 204 distinguished by means of MRI. Both the PD and the  $T_2$  value are evaluated for this purpose, and for a few 205 samples also the DC. Note that the units of PD are arbitrarily. The mean values of the MRI-data statistics 206 over the ROI (average and standard deviation of the MRI pixel distributions) of the different apple tissue 207 sample types (see Table 2) are presented in Figures 3-4. Error bars indicate the 95% confidence intervals, 208 based on the standard deviation on the mean values (of each ROI) considering all relevant samples, assuming 209 a normal distribution. In Figure 5, the corresponding relative frequency distributions of the PD and  $T_2$  value 210 of these samples are presented. For samples which showed visual IB (inner tissue of BB and BG), the 211 affected tissue will have an impact on the PD and  $T_2$  value statistics. Therefore, these samples are discussed 212 separately in section 3.4 during the analysis of IB, but they are included in Figures 3-5 for completeness. 213 Furthermore, it has to be acknowledged that the magnitude of the  $T_2$  value depends to some extent on the 214 strength of the magnetic field, due to changing field inhomogeneities at interfaces of tissues with different

magnetic susceptibilities (Musse et al., 2010). In addition,  $T_2$  values can also vary for different species and pre- and postharvest treatments, as shown below. Comparison with  $T_2$  values from previous research is thereby not entirely justified and relative comparison of these values within a specific batch of fruit is more appropriate. Note that, in addition to the aforementioned statistics, ANOVA was also performed (section 2.4) to support the analysis of Figures 3-4.

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222 Relatively large confidence intervals (thus standard deviations on the mean values) are found for some 223 sample types in Figures 3-4 indicating a large intersample heterogeneity. Note that also a relatively small 224 amount of samples was measured (Table 2), where an evaluation of more samples would provide more 225 reliable statistics. Such an extensive measurement campaign and the subsequent data analysis would be very 226 time consuming, and is not practically feasible for most applications of MRI in food engineering: MRI 227 studies are usually developing/applying MRI for detection of internal defects, online damage detection, e.g., 228 on a conveyor belt, or for process engineering (e.g., drying processes). Here, MRI should thus provide fast 229 but accurate information of the internal quality of food, namely for each individual specimen. From this 230 perspective, this study aims at investigating which characteristics can clearly be distinguished with MRI, 231 thus taking into account some intersample variability.

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The influence of the fertilisation type is analysed from Figures 3-4 by comparing: (1) the 0G with the 0B samples (one month storage); (2) the GG/BG with the BB/GB samples (four months storage). No significant differences between 0G and 0B samples can be noticed for the PD (average and standard deviation) of both inner and outer tissue: the mean value of one type usually falls well in between the confidence interval of the other one. A trend towards higher average  $T_2$  value is indicated by the 0B samples. When comparing the GG/BG with the BB/GB samples however, higher  $T_2$  values for apples with suboptimal fertilisation are not confirmed. With ANOVA, the influence of the fertilisation type is also found to be not distinctive. The used

<sup>233 3.1.</sup> Fertilisation

fertilisation treatment cannot clearly be distinguished by the MRI measurements performed in this study.This is not surprising since the influence of fertilisation is expected to have an impact on the storage life and

- shelf life, rather than on the water compartmentation in apple fruit and the related cell microstructure.
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246 3.2. Storage time

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248 The influence of storage time is analysed by comparing samples with one month storage and those with four 249 months storage in Figures 3-5. Regarding the outer tissue, a distinction between both storage periods can be 250 noticed, with higher values of the PD and  $T_2$  after four months storage. For the inner tissue, a trend to 251 systematically higher PD is also found, but the  $T_2$  value is, however, lower. The increase in PD with storage 252 time for inner and outer tissue is rather counter-intuitive since fruit lose moisture during storage (albeit 253 small), so they should contain less water. However, this moisture loss is to some extent accompanied with 254 the development of Braeburn browning disorder, which could induce a partial destruction of the cellular 255 integrity prior to the formation of larger cavities (Lammertyn et al., 2003a). This will change the water 256 distribution and compartmentation in the tissue, which could lead to the higher PD values: e.g., the inner 257 tissue samples of BB and BG, showing clear IB thus a partially destroyed cell integrity, have the largest PD. 258 These microstructural changes will also alter the water mobility, but only a slight trend towards higher  $T_2$ 259 values for the outer tissue can be noticed. From ANOVA, the storage conditions are found to be clearly 260 distinctive for the average PD. Note that generally, the amount of solutes remains quasi constant during 261 storage, which thereby will not be a reason for an increased PD. The PD standard deviation after four months 262 storage is larger for outer tissue but especially for inner tissue. For this parameter, ANOVA also confirmed 263 storage to be distinctive.

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265 3.3. Inner and outer tissue

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The influence of the tissue type (inner or outer cortex tissue) is analysed by comparing the samples for each type of apple (0G, 0B, GG, BB, GB, BG) separately, with respect to the tissue type, in Figures 3-4 and by

comparing the distributions of inner and outer tissue in Figure 5. As mentioned, samples which showed IB (inner tissue) are not discussed in this section, but note that their data are included in the analysis in this section. Typical PD,  $T_2$  and DC maps of inner and outer tissue are shown in Figure 6 for a GG type apple sample. The more heterogeneous nature of the inner tissue is clearly visible. Vascular bundles (visible in the outer tissue) appear brighter (for PD), in agreement with findings of Zion et al. (1995).

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275 For each apple type (e.g., GG), the average PD and  $T_2$  values of the inner tissue are higher than those of the 276 outer tissue. This indicates and confirms the lower porosity, higher moisture content and the larger pore size 277 of the inner tissue of apple, and thus also the higher water mobility (Schotsmans et al., 2004; Verboven et al., 278 2008; Mendoza et al., 2010). Furthermore, a higher  $T_2$  standard deviation of the inner tissue is found (Figure 279 4), compared to the outer tissue (mean value for all samples: inner tissue: 9.0, outer tissue: 7.0). These higher 280 values of the standard deviation could indicate the increased heterogeneity of the inner tissue's 281 microstructure. These findings are confirmed by ANOVA: the difference between inner and outer tissue for 282 the  $T_2$  value is found to be distinctive for the average value and the standard deviation.

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No clear trend is visible between the PD standard deviation of inner and outer tissue of each apple type, and their overall value is approximately similar (mean value for all samples: inner tissue: 116.4, outer tissue: 115.7). From ANOVA, a distinctive difference between inner and outer tissue for the PD is found for the average value, but not for the standard deviation, confirming the aforementioned findings.

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For a few samples (of GG and BB), self diffusion coefficient (DC) measurements were performed (see Table 2). The statistics are presented in Figure 7 for both inner and outer tissue. The corresponding relative frequency distribution is presented in Figure 8. The DC of the inner tissue shows much higher values than that of the outer tissue (both for healthy, i.e., GG, and affected tissue, i.e., BB), indicating the higher water mobility here, which is probably related to the larger cell sizes of the inner tissue (Schotsmans et al., 2004). Regarding standard deviation, no clear trends can be observed apart from the rather high values (and spread) for samples showing IB. ANOVA only indicated distinctive differences for the average DC value of both

- tissues. For comparison purposes, the obtained DCs are presented in Figure 9 together with those from previous MRI experiments. The results of the present study lie quite centralised within this range. Note that a large spread on the MRI data is found regarding apple cultivars.
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300 In conclusion, the PD,  $T_2$  value and DC are found to be all suitable MRI parameters for differentiation 301 between inner or outer tissue types. The  $T_2$  value (and its statistics) seems to reflect the heterogeneity (higher 302 standard deviation) of the inner tissue better, compared to the PD. Based on the few DC measurements that 303 were performed however, the DC seems to allow the most clear distinction between both types (i.e., the 304 largest differences of average values). These findings regarding tissue types are partially in contrast with 305 previous research by Musse et al. (2010). Although they argued that the overall heterogeneity within the 306 apple, namely the major morphological features (e.g., vascular bundles), could be distinguished by  $T_2$  maps, 307 they indicated that different parts of the apple cortex could not clearly be distinguished by multi-spin echo 308 images, which was shown to be possible in this study. Note that Keener et al. (1999) was able to distinguish 309 between tissues of different apple cultivars, based on the  $T_2$  value and DC, using low-field MRI.

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311 3.4. Internal browning

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313 The influence of IB, related to the storage conditions (CA), is analysed by comparing the samples of inner 314 tissue with visual IB (BB and BG, browning inducing CA storage) and without visual IB (GG and GB, 315 optimal CA storage). The statistics of the PD, the  $T_2$  value and the DC of these samples are presented in 316 Figures 3-4 and Figure 7 and their relative frequency distribution is given in Figures 5 and 8. Note that the 317 samples showing IB are not entirely affected, by which the influence of IB is biased to some extent by the 318 unaffected tissue, as indicated below. A typical BB sample is shown in Figure 10, together with the PD,  $T_2$ 319 value and the DC. In Figure 11, the average values of the PD,  $T_2$  value and DC are reported for the entire 320 sample of Figure 10 but also locally for ROI's of healthy and affected tissue separately. The corresponding PD,  $T_2$  value and DC frequency distribution of these ROI's of the BB sample are reported in Figure 12. Note 321 322 that the mean values for all GG and BB samples are also included in Figure 11.

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324 When considering the entire sample (inner tissue), the PD and the DC of the affected samples (BB and BG) 325 are higher than that of the healthy samples (GG and GB) but both generally fall in between each other's 326 confidence interval. From ANOVA, only the PD was found to be distinctive with respect to storage 327 conditions (IB). These overall sample data are however biased to some extent by the local unaffected tissue 328 for BB and BG samples, by which a local assessment of these MRI parameters is more suitable, e.g., as 329 indicated in Figure 12. From Figures 10-12, the (local) PD,  $T_2$  value and the DC of the affected tissue are 330 clearly higher than those of the healthy tissue. The presence of these two tissue types is also noticeable in the 331 distribution of the entire sample in Figure 12: for the PD distribution and to a lesser extent for the  $T_2$  value 332 distribution, the affected tissue results in a tail to the right, i.e., higher skewness, but for the DC, even two 333 distinct peaks appear (bimodal distribution). This could explain the higher (overall) PD and DC which are 334 found for BB type samples, compared to GG type samples (Figure 11). The biasing of the influence of IB by 335 the unaffected tissue with respect to the PD,  $T_2$  value and DC of the entire sample is also obvious from 336 Figure 11.

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338 From the PD,  $T_2$  value and DC maps of Figure 10, a region with lower values is found in the centre of the IB, 339 which is in contrast to the higher values that are generally found for affected tissue (as discussed in the 340 previous paragraph). This could be due to the partial destruction or degradation of the cellular structure, by 341 which water migrates to other regions in the fruit (and by which the diamagnetic susceptibility variations 342 decrease), leading to less water availability and mobility, and consequently the formation and presence of 343 cavities. Similar observations were made by McCarthy et al. (1995), which found lower  $T_2$  values for bruised 344 regions in apple fruit. Furthermore, it is remarkable that for the  $T_2$  value, the demarcation between healthy 345 and affected tissue is characterised by an increased  $T_2$  value, i.e., with higher values than in the IB region. 346 From these observations, different stages of IB seem to exhibit a different sensitivity to each of these MRI 347 parameters, related to different free water contents. A similar hypothesis, made by Lammertyn et al. (2003b) 348 for pear tissue, could explain the observed differences in MRI parameters within the affected tissue: initially, 349 the cell membranes in the tissue are affected and cells lose their integrity, resulting locally in a higher free

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355 In agreement with the present study, an increased signal intensity (thus PD) for IB areas was found by Clark 356 and Burmeister (1999) for Braeburn apple. According to Gonzalez et al. (2001), however, this increased 357 intensity could be related to the fact that no correction for relaxation times was applied for the signal 358 intensity (S), which is assumed to be directly proportional to the PD (e.g., Clark et al., 1997; Gonzalez et al., 359 2001). Without such a correction, changes in signal intensity could be due to changes of PD but also of 360 relaxation times (see Eq.(1), see section 2.2). Based on this correction, Gonzalez et al. (2001) found a lower 361 PD for IB for Fuji apples. In this study, such a correction was applied for the  $T_2$  value but not for the  $T_1$ 362 value, as this was considered less critical (as discussed in section 2.2). Future studies will investigate the 363 necessity of a correction for the  $T_1$  value more in detail. However, as mentioned in the previous paragraph, 364 both higher and lower PD can be found in affected tissue, depending on the rate of cellular degradation and 365 the rate of diffusion and evaporation of water out of the material. For the same reason, Lammertyn et al. 366 (2003b) also found lower PD intensities for affected tissue for pears, whereas Wang and Wang (1989) found 367 higher intensities.

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As in the present study, Gonzalez et al. (2001) found higher  $T_2$  values for dark brown areas. Gonzalez et al. (2001) argued that the  $T_2$  value provides the best contrast, compared to the  $T_1$  value and the PD. From this study (Figures 11-12), the DC however seems to be an even more appropriate parameter for IB detection. In general, regarding the detection of IB with MRI, the present study agrees with previous studies (e.g., Clark and Burmeister, 1999; Gonzalez et al., 2001): IB detection with MRI provides similar results as visual detection.

water content (high PD,  $T_2$  value and DC in the affected tissue in Figure 10). Consequently, this water diffuses away and evaporates, leading to drier, brown tissue with cavities (lower PD,  $T_2$  value and DC in the centre of the affected tissue in Figure 10). In the present study, a clear dependency of the different MRI parameters on the degree of tissue degradation was identified for apple tissue.

Note that these previous studies looked at an apple fruit with severe IB, namely where nearly the entire core (inner) tissue was affected. Here, the healthy tissue with which comparison was made, was nearly always outer tissue. As significant differences were found between inner and outer tissue for the MRI parameters (section 3.3), comparison between inner IB tissue and outer healthy tissue is not entirely justified as two parameters simultaneously affect the MRI results: internal browning but also tissue type, which could have an opposite effect. Healthy and IB tissue, both from the inner cortex, should actually be compared, which was done in the present study.

383

384 Low-field MRI studies on IB (Keener et al., 1999; Chayaprasert and Stroshine, 2005; Cho et al., 2008), 385 usually applied the Carr-Purcell-Meiboom-Gill (CPMG) pulse sequence technique for  $T_2$  value evaluation. 386 Often the resulting signal was fitted with an exponential equation, with one or more exponential terms. One 387 or more parameters in this equation were then associated to  $T_2$  relaxation. A lower  $T_2$  has been found for IB 388 (Keener et al., 1999; Chayaprasert and Stroshine, 2005), in contrast to the present study and other studies not 389 using the CPMG pulse sequence. Using a three-term exponential model, Cho et al. (2008) found a more 390 complex dependency of the  $T_2$ -related parameters on IB. Furthermore, Keener et al. (1999) found no effect of 391 IB on the self diffusion coefficient of water, in contrast to the present study.

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# **4. Conclusions**

395 In this study, high-field MRI was used for tissue characterisation of apples of the Braeburn variety. In 396 contrast to most previous studies, small samples were considered instead of an entire apple, providing very 397 local, high-resolution information. The aim of such tissue characterisation was to identify which differences 398 in tissue types could be clearly distinguished with MRI, i.e., with respect to inner and outer cortex tissue, 399 fertilisation treatment, storage time (i.e., duration of CA storage) and internal browning (IB, related to 400 storage conditions). The quantities chosen for this analysis were the proton density (PD), the  $T_2$  value and the 401 self diffusion coefficient of water (DC). No clear distinction could be made between samples with different 402 fertilisation treatments. Differences in storage times could be observed from an increased PD for longer

403	storage times. Inner tissue clearly showed an increased PD, $T_2$ value and DC, compared to outer tissue. IB				
404	could be successfully detected, where the PD, $T_2$ value and the DC of the affected tissue were clearly higher				
405	than those of the healthy tissue but a dependency of these parameters on the degree of tissue degradation was				
406	identified. Especially the DC seemed to be an appropriate parameter regarding IB detection. Such tissue				
407	characterisation, i.e., the topic of the present study, is an important step towards the commercial use of MRI				
408	for non-destructive quality control, e.g., for IB or mealiness detection.				
409					
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414	OT 08/023). The opinions expressed in this document do by no means reflect the official opinion of the				
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500 Figures



502 Figure 1. Cylindrical apple core, taken along equator (with cork borer), from which cylindrical

- 503 samples were cut: (a) overview; (b) section through apple.
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Figure 2. (a) Mounting of four cylindrical apple samples by means of a test tube in the coil of the NMR
spectrometer; (b) Side view of test tube with four samples where transverse slices are indicated.

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514 Figure 3. Average  $T_2$  value and proton density (of the ROI) of apple samples taken from both the inner 515 and outer tissue for apples with different fertilisation types and storage conditions. The mean value of 516 all considered samples (see Table 2) and the 95% confidence intervals for this mean value are shown 517 (indicated with error bars).

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520 Figure 4. Standard deviation (Stdev) of  $T_2$  value and proton density (of the ROI) of apple samples 521 taken from both the inner and outer tissue for apples with different fertilisation types and storage 522 conditions. The mean value (of the standard deviation) of all considered samples (see Table 2) and the 523 95% confidence intervals for this mean value are shown (indicated with error bars).

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- 529 Figure 5. Relative frequency distribution of  $T_2$  value and proton density (of the ROI) for inner and
- 530 outer tissue: Distinction between apples after one month (black lines) and four months storage (red
- 531 and blue lines). Samples with visual internal browning are represented by blue lines.

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533



OUTER tissue INNER tissue

535

536 Figure 6. Proton density,  $T_2$  value and diffusion coefficient maps of a typical GG apple sample for

537 inner and outer tissue.

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Figure 7. Average and standard deviation (Stdev, of the ROI) of the diffusion coefficient (DC) of apple samples taken from both the inner and outer tissue for apples with different fertilisation types and storage conditions (types BB and GG). The mean value (of each parameter) of all considered samples (see Table 2) and the 95% confidence intervals for this mean value are shown (indicated with error bars).

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550 Figure 8. Relative frequency distribution of diffusion coefficient (of the ROI) for inner and outer 551 tissue: Distinction between apples (types BB and GG) with (red lines) and without (black lines) visual 552 internal browning. The bold red line indicates affected inner tissue with a bimodal distribution.

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556 Figure 9. Diffusion coefficients of apple (logarithmic scale) as determined by means of MRI

557 measurements.



PD = 0T2 = 0 ms DC = 0 m<sup>2</sup>/s

- 561 Figure 10. A photo, proton density,  $T_2$  value and diffusion coefficient of inner tissue of a typical BB
- 562 type sample with internal browning. The ROI's of the healthy and affected tissue are indicated by the
- 563 circles.
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Figure 11. Proton density,  $T_2$  value and diffusion coefficient of inner tissue for all GG samples, all BB samples (mean values of each parameter of all considered samples (see Table 2) and the 95% confidence intervals) and for a specific BB type sample with internal browning (Figure 10), namely for ROI's of the entire sample (BB\_tot), healthy (BB\_noIB) and affected tissue (BB\_IB). These ROI's are indicated in Figure 10.

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576 Figure 12. Relative frequency distribution of proton density,  $T_2$  value and diffusion coefficient of inner 577 tissue of a specific BB type sample with internal browning (Figure 10) for ROI's of healthy tissue, 578 affected tissue and the entire sample. The ROI's are indicated in Figure 10.

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## 586 Tables

## 587 Table 1. Experimental characteristics of MRI measurements on tissue characterisation.

Method	Multi-spin echo	Diffusion spin echo
Field of view (mm <sup>2</sup> )	30x30	30x30
Field of view (pixel <sup>2</sup> )	256x256	128x128
Pixel size (mm)	0.117	0.234
Slice thickness (mm)	0.5	1
Repetition time $(T_R)$ (ms)	3000	2300
Echo time $(T_E)$ (ms)	7-112 (in 16 steps)	13.5
Duration of measurement	12 min	56 min

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589

## 591 Table 2. Characteristics of Braeburn apple samples for tissue characterisation with MRI (see section

# 592 **2.1 for nomenclature).**

Name	Storage	Fertilisation	Tissue	Number of measurements		Remarks
			type			
				PD & $T_2$ value	DC	
Measure	ments Nov	vember 2010				
0G	-	G	Inner	2	-	No visual IB
			Outer	2	-	No visual IB
0B	-	В	Inner	6	-	No visual IB
			Outer	6	-	No visual IB
Measurements March 2011						
GG	G	G	Inner	4	2	No visual IB
			Outer	5	3	No visual IB
GB	G	В	Inner	2	-	No visual IB
			Outer	2	-	No visual IB
BG	В	G	Inner	2	-	Clear visual IB
			Outer	2	-	No visual IB
BB	В	В	Inner	5	3	Clear visual IB
			Outer	5	2	No visual IB