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Probing the metabolic phenotype of breast cancer cells by multiple tracer stable isotope resolved metabolomics



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ABSTRACT

Breast cancers vary by their origin and specific set of genetic lesions, which gives rise to distinct phenotypes and differential response to targeted and untargeted chemotherapies. To explore the functional differences of different breast cell types, we performed Stable Isotope Resolved Metabolomics (SIRM) studies of one primary breast (HMEC) and three breast cancer cells (MCF-7, MDAMB-231, and ZR75-1) having distinct genotypes and growth characteristics, using ¹³C₆-glucose, ¹³C-1+2-glucose, ¹³C₅, ¹⁵N₂-Gln, ¹³C₃-glycerol, and ¹³C₈-octanoate as tracers. These tracers were designed to probe the central energy producing and anabolic pathways (glycolysis, pentose phosphate pathway, Krebs Cycle, glutaminolysis, nucleotide synthesis and lipid turnover). We found that glycolysis was not associated with the rate of breast cancer cell proliferation, glutaminolysis did not support lipid synthesis in primary breast or breast cancer cells, but was a major contributor to pyrimidine ring synthesis in all cell types; anaplerotic pyruvate carboxylation was activated in breast cancer versus primary cells. We also found that glucose metabolism in individual breast cancer cell lines differed between in vitro cultures and tumor xenografts, but not the metabolic distinctions between cell lines, which may reflect the influence of tumor architecture/microenvironment.

1. Introduction

Breast cancer continues to be a major disease afflicting 290,000 people every year in the US, of which ca. 40,000 died (ACS, 2016). Although in recent years, improved surgical techniques, diagnostic procedures and targeted therapeutics such as trastuzumab and anti-estrogen treatment have significantly improved the overall survival

rates for those patients who can benefit (Hudis, 2007) (Bliss, Kilburn et al., 2012), recurrence remains a problem. In addition, some forms of breast cancer are refractory to treatment, in particular the triple negative breast cancers and BRCA1 and 2 breast cancers. As with many cancers, 5-year survival rates decrease markedly with increasing stages as the options for treatment become limited (ACS, 2016).

Although numerous genetic lesions that are responsible for the

Abbreviations: DSS, 2,2-dimethyl silapentane-5-sulfonate; ER⁺, estrogen receptor positive; FID, free induction decay; FT-ICR-MS, fourier transform-ion cyclotron resonance-mass spectrometry; HMEC, human mammary epithelial cell; PPP, Pentose Phosphate Pathway; TCA, trichloroacetic acid; SIRM, Stable Isotope Resolved Metabolomics; TME, tumor microenvironment

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the University of Louisville IACUC. Orthotopic xenografts were achieved by injecting cells at 1–10 million per mL in matrigel directly into the mammary fat pad of female mice in groups of 5. For estrogen-dependent cells, estradiol was supplied to the mice.

Once tumors reached a size of 0.5–1 cm, the mice were injected via the tail vein with either [U-¹³C]-glucose or [U-¹³C,¹⁵N]-glutamine 3 times with a spacing of 15 min, as previously described (Fan, Lane et al., 2011; Lane, Yan et al., 2015). At 1 and 45 min after the first injection, blood samples were taken introrbitally, placed into K₂-EDTA tubes and allowed to stand for 1 min at room temperature before being chilled on ice. The blood was then separated into plasma and packed cells by centrifugation at 3500g for 15 min at 4 °C. Plasma was aspirated and flash frozen in liq. N₂ for subsequent analysis. The mice were then sacrificed by cervical dislocation, and the tumors excised and flash frozen in liquid nitrogen. Lung, liver, heart, kidney and brain were sequentially dissected and also flash frozen in liquid nitrogen for metabolic analysis (Fan, Lane et al., 2011; Lane, Yan et al., 2015).

2.4. Metabolite extractions

Media at different time points were sampled and flash frozen for subsequent extraction using trichloroacetic acid (Fan et al., 2008) and analysis by NMR. Cells were quenched and extracted with 10% ice-cold trichloroacetic acid or acetonitrile:H₂O: chloroform (2:1.5:1, v/v) as previously described (Fan, 2010, 2012). To calculate the relative consumption of ¹³C glucose and ¹³C and ¹²C lactate production, 100 μL aliquots of the media at t=0 and t=24 h were extracted and analyzed by ¹H NMR, which distinguishes ¹³C and ¹²C lactate isotopomers (Lane and Fan, 2007). Glucose was quantified from the H1a resonances, and the lactate from the C3H resonances. The amount of glucose consumed or lactate produced was calculated as the difference in glucose or lactate content in the media between zero and 24 h. The fraction of glucose consumed that was converted to ¹³C lactate, F_{Glc→Lac} was calculated as:

$$F_{\text{Glc} \rightarrow \text{Lac}} = \frac{[^{13}\text{C} - \text{Lac}]/2\Delta[^{13}\text{C} - \text{Glc}]}{1} \quad (1)$$

The fractional enrichment of lactate, was calculated as

$$f_{\text{Lac}} = \frac{[^{13}\text{C}-\text{Lac}]/\{[^{13}\text{C}-\text{Lac}] + [^{12}\text{C}-\text{Lac}]\}}{1} \quad (2)$$

as previously described (Lane and Fan, 2007; Lane et al., 2008, 2009; Lane, 2012; Fan and Lane, 2016). In these experiments, cells were seeded at the same density. The amount of valine consumption over the experimental period was determined to be negligible compared with glucose and lactate, and thus was used as an internal concentration standard.

For the cells, both polar and non-polar (lipids) were analyzed by high resolution NMR and Fourier transform-ion cyclotron resonance-mass spectrometry (FT-ICR-MS).

2.5. Mass Spectrometry

Ultra high-resolution mass spectra were recorded by direct nano-electrospray infusion on a Thermo LTQ-FT ICR-MS interfaced to an Advion Nanomate ESI at a resolution of 400,000 at *m/z* of 200 Da. Data were processed and assigned as previously described (Lane et al., 2008; Higashi, Fan et al., 2014).

2.6. NMR spectroscopy

NMR spectra were recorded at 14.1 T or 18.8 T on Varian Inova spectrometers at 293 K and compounds were identified and quantified as previously described (Fan and Lane, 2008, 2012).

1D ¹H NMR spectra were recorded with an acquisition time of 2 s and a relaxation delay of 3 s during which the residual HOD resonance was suppressed using a weak transmitter pulse. The FIDs were zero

filled to 128 k points, and apodized using an unshifted Gaussian and a 0.5 Hz line broadening exponential function. 1D HSQC spectra were recorded with an acquisition time of 0.15 s and a relaxation delay of 1.35 s with GARP decoupling. The FIDs were zerofilled to 8192 points and apodized using an unshifted Gaussian and a 4 Hz line broadening exponential. TOCSY spectra were recorded with an acquisition time of 0.5 s in *t*₂ and 0.05 s in *t*₁. The data table was zerofilled to 8192 by 2048 points, and apodized using an unshifted Gaussian and a line broadening exponential of 1 Hz in both dimensions. 2D ¹H{¹³C}-HSQC were recorded with an acquisition time of 0.15 s in *t*₂ and 0.0125 s in *t*₁. Data in *t*₁ were linear predicted once and zerofilled to 2028 points, and apodized using an unshifted Gaussian plus a line broadening exponential of 4 Hz in *t*₁, and 1 Hz in *t*₂.

Spectra were referenced to DSS, which also served as a concentration standard.

Quantitative isotopomer distributions in metabolites were determined of both polar and non-polar (lipid) extracts by 1 and 2D NMR spectra as previously described (Lane and Fan, 2007; Lane et al., 2008, 2009; Lane, 2012; Fan and Lane, 2016).

3. Results

We have investigated the utilization of different substrates in three breast carcinoma and one primary breast cell lines under standardized growth conditions. These cell lines have different doubling rates and dependence on estradiol (Table 1).

3.1. ¹³C₆-glucose reveals differential capacity of glycolysis and glucose consumption among breast cell lines

The four breast cancer cell lines were grown in ¹³C₆-glucose (Glc) for 24 h before the polar extracts of both cells and media were analyzed by ¹H NMR.

Table 2 compares the normalized amounts of ¹³C₆-Glc consumed, ¹³C₃-lactate (Lac) released, and fractional conversion of ¹³C₆-Glc to ¹³C₃-Lac (F_{Glc→Lac}) in the media. The F_{Glc→Lac} ranged from 0.28 to 0.62, with ZR-75-1 showing the highest value, which together with the highest ¹³C₃-Lac release in the medium suggested that the slow-growing ZR-75-1 had the highest glycolytic capacity among the four cell lines. It is also interesting to note that the fastest growing MDA-MB231 were similar to the primary HMEC in terms of F_{Glc→Lac} and ¹³C₃-Lac release into the medium, which indicated that glycolytic capacity was not always linked to proliferation rates. Furthermore, ¹H NMR analysis readily quantified both ¹³C labeled and unlabeled lactate (¹²C₃-Lac), which showed that the MDA-MB-231 had lower extent of ¹²C₃-Lac release relative to HMEC and ZR-75-1 cells (Table 2). This result suggested that HMEC and ZR75-1 produced more lactate from sources other than glucose (Lane, Fan et al., 2011). However, this lactate production did not involve classical glutaminolysis since little ¹³C-Lac was derived from ¹³C-glutamine (data not shown).

Table 2
Comparison of medium glucose consumption and lactate release by four breast cell lines.

| Cell lines | Norm. nmoles/mL consumed or produced ^a | | | | % ¹² C ₃ / ¹³ C ₃ -Lac |
|------------|---------------------------------------------------|-----------------------------------|-----------------------------------|----------------------|--------------------------------------------------------------------|
| | ¹² C ₃ -Lac | ¹³ C ₃ -Lac | ¹³ C ₆ -Glc | F _{Glc→Lac} | |
| HMEC | 6.15 | 69.85 | -78.26 | 0.45 | 8.80 |
| MCF7 | 0 | 8.62 | -15.44 | 0.28 | 0 |
| ZR751 | 8.37 | 120.07 | -96.75 | 0.62 | 6.97 |
| MDAMB231 | 2.23 | 57.24 | -64.27 | 0.45 | 3.89 |

^a Glucose consumed or lactate produced over 24 h period was quantified from ¹H NMR data and normalized to the valine content of the medium as described in the Methods. F_{Glc→Lac} is the fraction of the glucose consumed and excreted as ¹³C₃ lactate and % ¹²C₃/¹³C₃-Lac is the percent of the medium lactate that was not derived from ¹³C₆-glucose.

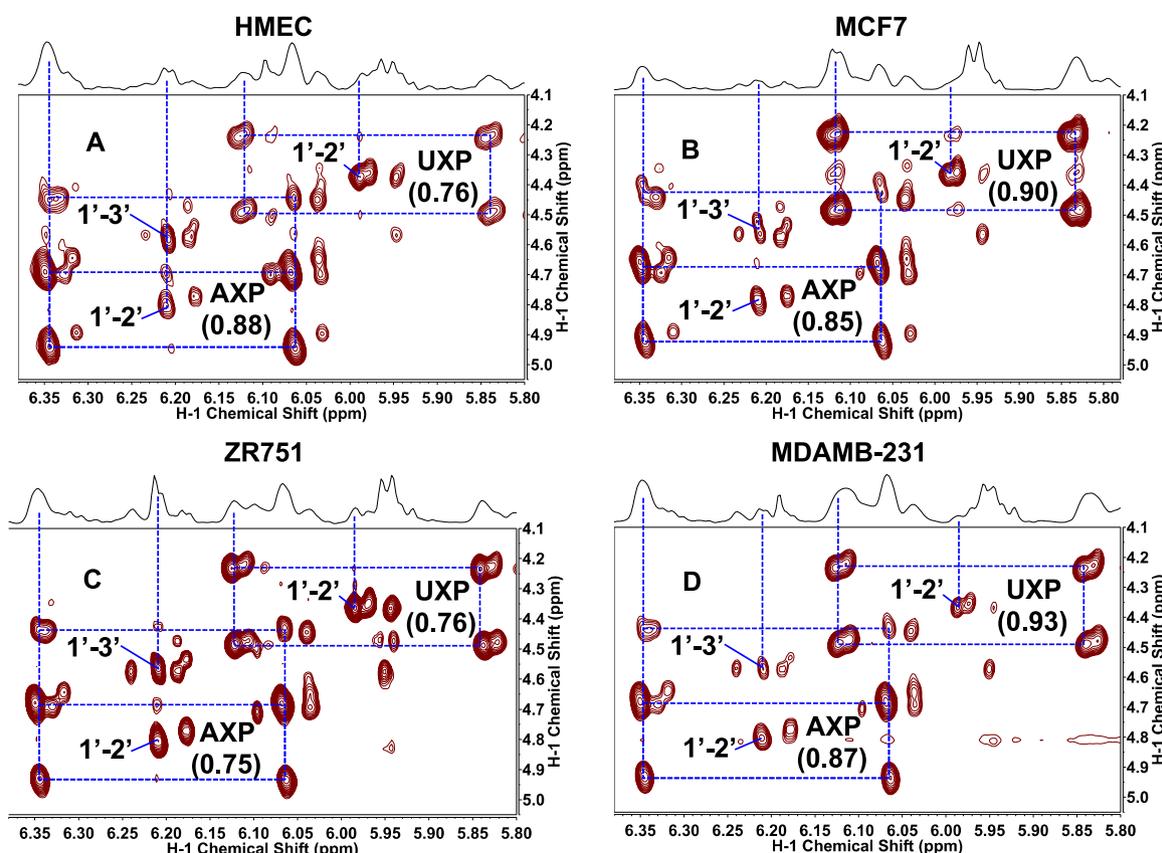


Fig. 2. 2D ¹H TOCSY Spectra of four breast cell lines grown in the presence of ¹³C₆-glucose show differential capacity for ribose incorporation into nucleotides. TCA extracts were prepared from cells grown for 24 h in the presence of ¹³C₆-glucose. 2D TOCSY contour maps were shown along with the corresponding 1D high-resolution ¹H spectra. Dashed boxes delineate ¹³C satellite cross-peaks for the H1' (x-axis) to H2' and H3' (y-axis) in the ribosyl unit of adenine (AXP) and H1' to H2/H3' in the ribosyl unit of uracil (UXP) nucleotides. Such ¹³C labeling patterns are consistent with the presence of ¹³C₅-ribose subunits in both types of nucleotides, which in turn suggests the operation of PPP via the oxidative and/or non-oxidative branches. Values in parenthesis denote fractional ¹³C enrichment in the ribosyl unit of AXP or UXP at the 1' position. A. HMEC; B. MCF-7; C. ZR-75-1; D. MDA-MB-231.

3.2. Breast cell lines exhibit differential capacity for oxidative and non-oxidative branches of the pentose phosphate pathway (PPP)

Proliferating cells require active pentose phosphate pathway (PPP) to supply ribose-5-phosphate (R5P) for the synthesis of nucleotides, DNA, and RNA. The operation of PPP was demonstrated in the four cell lines with the use of ¹³C₆-glucose, which showed the expected ¹³C incorporation into the ribose moiety of different nucleotides (Fig. 2). Volume integration of the central ¹²C and ¹³C satellite cross-peaks provided the fractional ¹³C enrichment (Lane and Fan, 2007) in the ribosyl unit of adenine (AXP) and uracil (UXP) nucleotides at the 1' position. These values differed among the four cell lines with the slow growing ZR75-1 having the lowest values for both AXP and UXP among the four cell lines, which could point to a lower PPP capacity for ZR75-1 than for the other three cell lines. Alternatively, ZR75-1 may derive its ribose from non-glucose source(s) and/or have a lower capacity for nucleotide synthesis.

The PPP can also supply NADPH for fatty acid biosynthesis (see below) and redox homeostasis via glutathione metabolism. However, the PPP generates NADPH only via the oxidative and not the non-oxidative branch. The relative contribution of these two branches of PPP is not readily delineated using ¹³C₆-glucose as tracer. We thus investigated the capacity for these two branches of PPP using an equimolar mixture of ¹³C-1- and ¹³C-2- glucose tracers with 2D ¹H TOCSY NMR analysis of the positional isotopomers in the ribose rings of purine and pyrimidine nucleotides. If only the oxidative branch (Ox PPP) is operative, then the ¹³C1' (●) of the nucleotide riboses (Fig. 3), resulting in a pair of horizontal ¹³C satellite cross-peaks for UXP-1' and

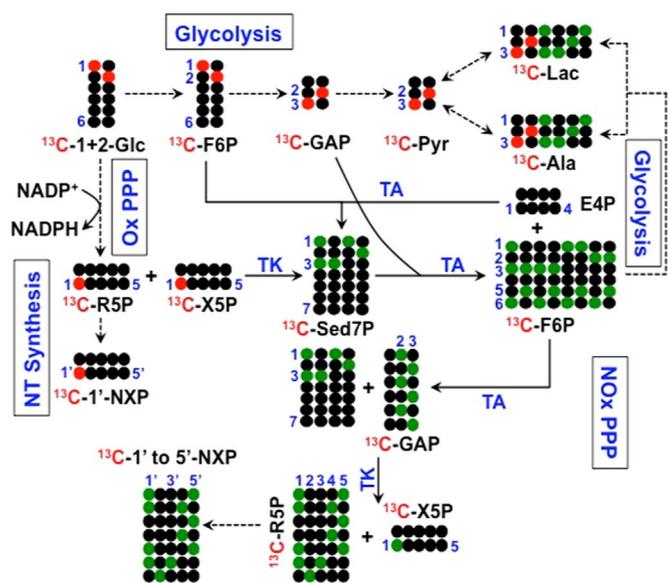


Fig. 3. ¹³C atom tracing of ¹³C-1+¹³C-2-glucose transformations via glycolysis, PPP, and nucleotide (NT) biosynthesis. TCA extracts were prepared from cells grown for 24 h in the presence of equimolar ¹³C-1- and ¹³C-2-glucose. ● denotes ¹²C while ● denotes ¹³C derived from OxPPP and NOxPPP, respectively. Ox PPP and NOx PPP: oxidative and non-oxidative branches of the pentose phosphate pathway, respectively; Glc: glucose; F6P: fructose-6-phosphate; GAP: glyceraldehyde-3-phosphate; Pyr: pyruvate; Lac: lactate; R5P: ribose-5-phosphate; X5P: xylulose-5-phosphate; Sed7P: sedoheptulose-7-phosphate; NXP: nucleotides; TK: transketolase; TA: transaldolase.

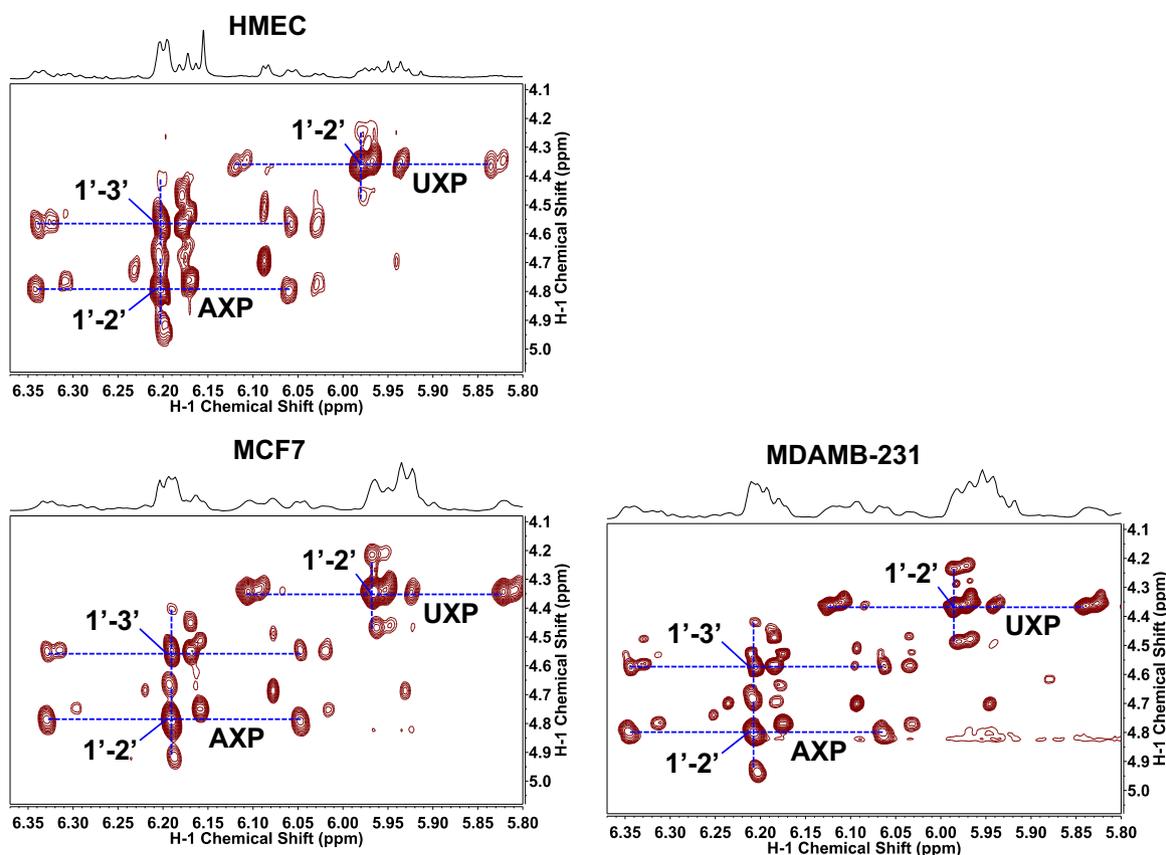


Fig. 4. 2D ^1H TOCSY Spectra of three breast cell lines grown in the presence of ^{13}C -1-+ ^{13}C -2-glucose reveal differential capacity for oxidative and non-oxidative branches of the pentose phosphate pathway. TCA extracts were prepared from cells grown for 24 h in the presence of ^{13}C -1-+ ^{13}C -2 glucose. ^{13}C labeling patterns in the ribosyl subunits of nucleotides. These labeling pattern showed that both oxidative and non-oxidative branches of the PPP were active. Dashed lines indicated ^{13}C satellite cross-peaks at given atomic positions of metabolites.

AXP-1' in the TOCSY spectra (Fig. 4). In contrast, if the non-oxidative branch of the PPP (NOx PPP) is active, then the ribose labeling patterns become more complex, as ^{13}C labels at C1 or C2 positions of glucose is metabolized into F6P at C1 or C2 and GAP at C2 or C3 via glycolysis, followed by ^{13}C scrambling (●) when GAP is incorporated into the intermediates of PPP including F6P, Sed7P, R5P, and X5 P via the reversible reactions of transketolase (TK), transaldolase (TA). Further metabolism of R5P via nucleotide synthesis and F6P via glycolysis results in ^{13}C labels respectively at C1' to C5' position of the ribose subunit of nucleotides as well as at C1 to C3 position of lactate and Ala (Fig. 3).

Fig. 4 showed strong ^{13}C enrichment at C2' of AXP/UXP (vertical pair of ^{13}C satellites for the C1'-2' cross-peaks) and to a lesser extent at C3' of AXP (vertical pair of ^{13}C satellites for the C1'-3' cross-peak), in addition to the intense C1' of AXP and UXP (horizontal pair of ^{13}C satellites for the C1'-2'/C1'-3' cross-peaks) in HMEC, MCF7, and MDAMB-231 cells. This demonstrates that the NOx PPP was active as ^{13}C labels in C2' and C3' of ribose can only be derived from ^{13}C -1- + ^{13}C -2-glucose via NOx PPP (cf. Fig. 3). By quantifying the fractional enrichment (F) at C1' and C2' of the ribose units of AXP and UXP via the central ^{12}C and ^{13}C satellite cross-peaks (Fan, Tan et al., 2012), we determined that the ratio of $F_{1'AXP}$ to $F_{2'AXP}$ or $F_{1'UXP}$ to $F_{2'UXP}$ was higher in the carcinoma MCF7 and MDAMB-231 than the primary HMEC cell lines (Table 3). This result suggested that Ox PPP was relatively more active than NOx PPP in the cancer versus the primary breast cell lines, thereby contributing to more NADPH production in the former. We further noted that the ^{13}C labeling at C2 (vertical pair of ^{13}C satellites, Fig. S1) was relatively more extensive than that at C3 (horizontal pair of ^{13}C satellites, Fig. S1) of lactate and Ala in HMEC

versus MCF7 and MDAMB-231 cell lines, which pointed to relatively higher PPP than glycolytic capacity in HMEC compared with the two cancer cell lines. This is because Ox PPP operation would lead to the loss of C3 labels while NOx PPP contributed to C2 labels of lactate and Ala (Fig. 3), thereby leading to selective ^{13}C enrichment at C2 of these two metabolites in HMEC cells. The absolute fluxes through the branches of the PPP have not been determined in these experiments, which also requires a full accounting of the carbon flow into the excreted lactate and alanine.

3.3. Both glucose and glutamine fuel Krebs cycle and pyrimidine biosynthesis

Both glucose and Gln can be metabolized through the Krebs cycle to produce Asp, which is the precursor to pyrimidine ring synthesis (Fig. 5).

We investigated these pathways by 2D ^1H TOCSY analysis, which revealed the ^{13}C labeling patterns of uracil rings in UXP of three breast cell lines grown in $^{13}\text{C}_6$ -glucose or $^{13}\text{C}_5,^{15}\text{N}_2$ -Gln. As shown in Fig. 6 and Table 4, ^{13}C atoms from both tracers were incorporated into the uracil ring at C5 and/or C6 in HMEC, MCF7, and ZR75-1 cells. $^{13}\text{C}_5,^{15}\text{N}_2$ -Gln contributed more substantially to these uracil carbons than $^{13}\text{C}_6$ -Glc in HMEC and ZR75-1 cells as we have observed previously for lung cancer cells (Fan et al., 2012). However, the opposite was evident for MCF7 cells. In addition, MCF7 and ZR75-1 cells showed a higher fractional enrichment in $^{13}\text{C}_6$ -Glc-derived uracil at C5,6 than HMEC. This ^{13}C isotopomer is likely to be produced from the anaplerotic pyruvate carboxylation (PC) pathway, as shown in Fig. 5 (denoted by ●) (Le et al., 2012a, 2012b; Sellers et al., 2015).

Table 3
Fractional enrichment in nucleotide riboses from ^{13}C -1+ ^{13}C -2 glucose.

| Cell lines | $^1\text{F}_{1'\text{AXP}}$ | $\text{F}_{2'\text{AXP}}$ | $\text{F}_{1'\text{AXP}}/\text{F}_{2'\text{AXP}}$ | $\text{F}_{1'\text{UXP}}$ | $\text{F}_{2'\text{UXP}}$ | $\text{F}_{1'\text{UXP}}/\text{F}_{2'\text{UXP}}$ |
|------------|-----------------------------|---------------------------|---------------------------------------------------|---------------------------|---------------------------|---------------------------------------------------|
| HMEC | 0.321 | 0.425 | 0.757 | 0.262 | 0.343 | 0.764 |
| MCF7 | 0.405 | 0.346 | 1.169 | 0.468 | 0.265 | 1.767 |
| MDAMB-231 | 0.356 | 0.273 | 1.307 | 0.432 | 0.243 | 1.782 |

^a Fractional ^{13}C enrichment was determined from relevant central ^{12}C and ^{13}C satellite cross-peaks in Fig. 4.

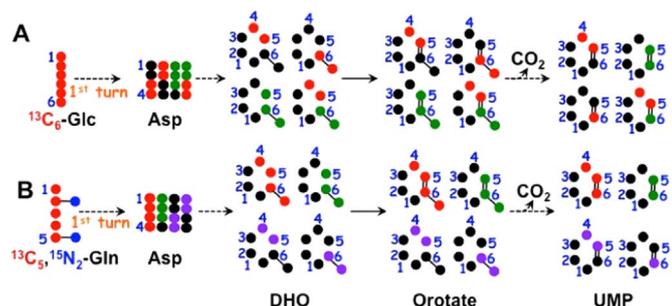


Fig. 5. ^{13}C tracing from $^{13}\text{C}_6$ -Glc or $^{13}\text{C}_5, ^{15}\text{N}_2$ -Gln into uracil ring. The two sets of atom tracing depict the transformation of $^{13}\text{C}_6$ -Glc (A) or $^{13}\text{C}_5, ^{15}\text{N}_2$ -Gln (B) into Asp via the first turn of the Krebs cycle, and then into the uracil ring of UMP via the pyrimidine synthesis pathway. \bullet : ^{12}C ; \bullet : ^{13}C from pyruvate dehydrogenase-initiated Krebs cycle in A or from glutaminolysis+Krebs cycle in B; \bullet : ^{13}C from pyruvate carboxylase-initiated Krebs cycle; \bullet : ^{13}C from glutaminolysis+Krebs cycle+malic enzyme (Le et al., 2012a, 2012b); DHO : dihydroorotate.

Thus, the two anaplerotic pathways involving PC and glutaminolysis may be differentially utilized by different breast cell lines.

3.4. Phospholipid biosynthesis differs among breast cell lines and sources

In addition to providing Asp for pyrimidine ring synthesis, glucose or Gln metabolism via the Krebs cycle supplies citrate as precursor for phospholipid biosynthesis, which is required for cell proliferation.

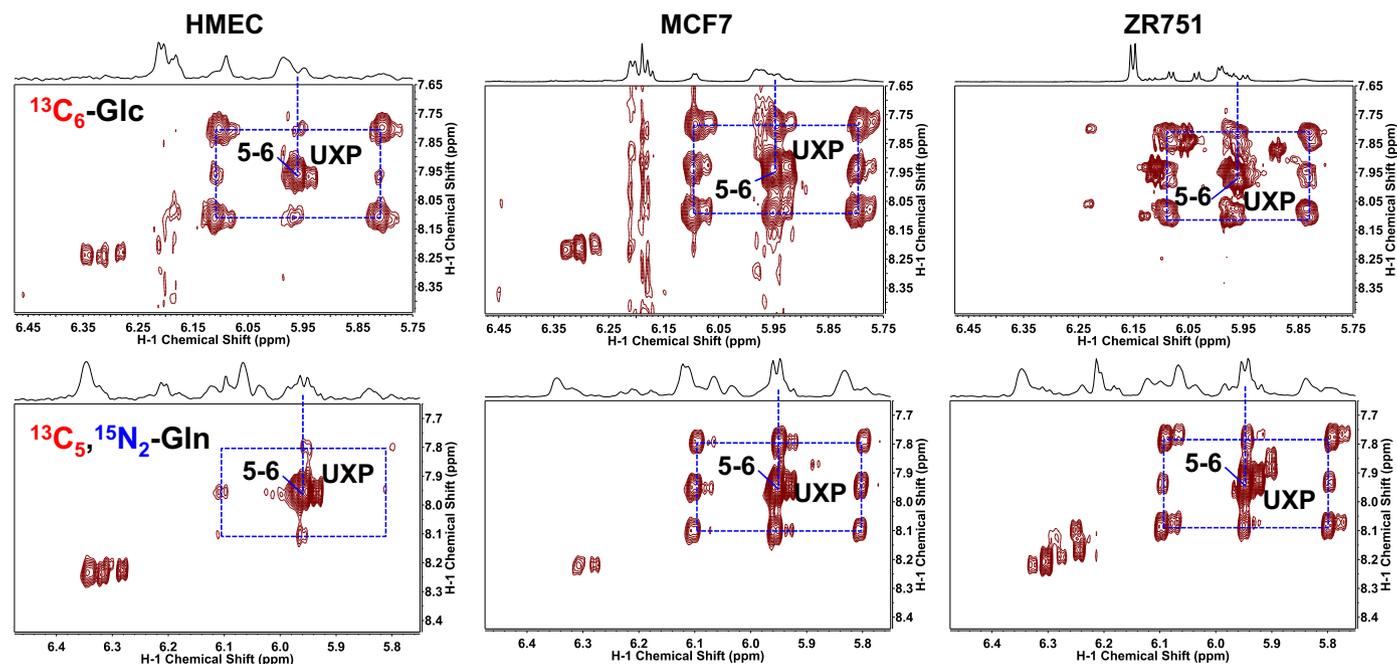


Fig. 6. ^{13}C incorporation from $^{13}\text{C}_6$ -glucose versus $^{13}\text{C}_5, ^{15}\text{N}_2$ -Gln into pyrimidine nucleotides in three breast cell lines. Cells were grown for 24 h in the presence of 5 mM each labeled glutamine (A) or glucose (B) tracer. 2D TOCSY spectra were recorded at 600 or 800 MHz using a mixing time of 50 ms along. The 2D TOCSY contour maps were shown along with the 1D high-resolution ^1H spectra. Dashed boxes depicted the ^{13}C satellites of C5 to C6 cross-peaks of the uracil ring in UXP with horizontal pairs, vertical pairs, and 4-corner satellites representing ^{13}C labeling at C5, C6, and C5,6 of uracil, respectively.

Table 4
Fractional ^{13}C enrichment at C5, C6, and C5,6 of UXP in three breast cell lines.

| Cell lines | $^{13}\text{C}_6$ -Glc | | | $^{13}\text{C}_5, ^{15}\text{N}_2$ -Gln | | |
|------------|----------------------------|--------------------------|----------------------------|-----------------------------------------|--------------------------|----------------------------|
| | $^a\text{F}_{5\text{UXP}}$ | $\text{F}_{6\text{UXP}}$ | $\text{F}_{5,6\text{UXP}}$ | $\text{F}_{5\text{UXP}}$ | $\text{F}_{6\text{UXP}}$ | $\text{F}_{5,6\text{UXP}}$ |
| HMEC | 0.160 | 0.150 | 0.151 | 0.228 | 0.388 | 0.695 |
| MCF-7 | 0.272 | 0.352 | 0.327 | 0.194 | 0.235 | 0.397 |
| ZR75-1 | 0.121 | 0.147 | 0.389 | 0.459 | 0.396 | 0.739 |

F is the fractional enrichment defined as $^{13}\text{C}/(^{12}\text{C}+^{13}\text{C})$ for the designated sites. UXP is UMP+UDP+UTP and 5,6 are the positions in the uracil ring

Thus, the critical enzymes of fatty acid biosynthesis are commonly up regulated in cancer cells (Kuhajda, 2000; Vazquez-Martin et al., 2008; Daniëls et al., 2014). We have previously shown extensive de novo synthesis of complex lipids from glucose in the tamoxifen-resistant MCF-7 variant LCC2 cell line (Lane et al., 2009). Here, we compared ^{13}C incorporation from $^{13}\text{C}_6$ -glucose into glycerophospholipids of HMEC, MCF-7 (Fig. 7A, B), and ZR75-1 (Fig. 8A) versus the faster growing MDA-MB-231 cells (Fig. 7C). Both glycerol backbone and fatty acyl chains of PLs were strongly labeled in HMEC, MCF-7, and ZR75-1 cells grown in the presence of $^{13}\text{C}_6$ -glucose. The ^{13}C satellite cross-peak patterns of the glycerol backbone (peaks 2, 4, 5, 8, and 10, Fig. 7) indicated the presence of the $^{13}\text{C}_3$ -isotopomer species only, which is consistent with its synthesis from dihydroxyacetone-3-phosphate (DHAP) in the glycolytic pathway. The ^{13}C -labels in the fatty acyl chains were presumably derived from ^{13}C -acetyl CoA, generated from

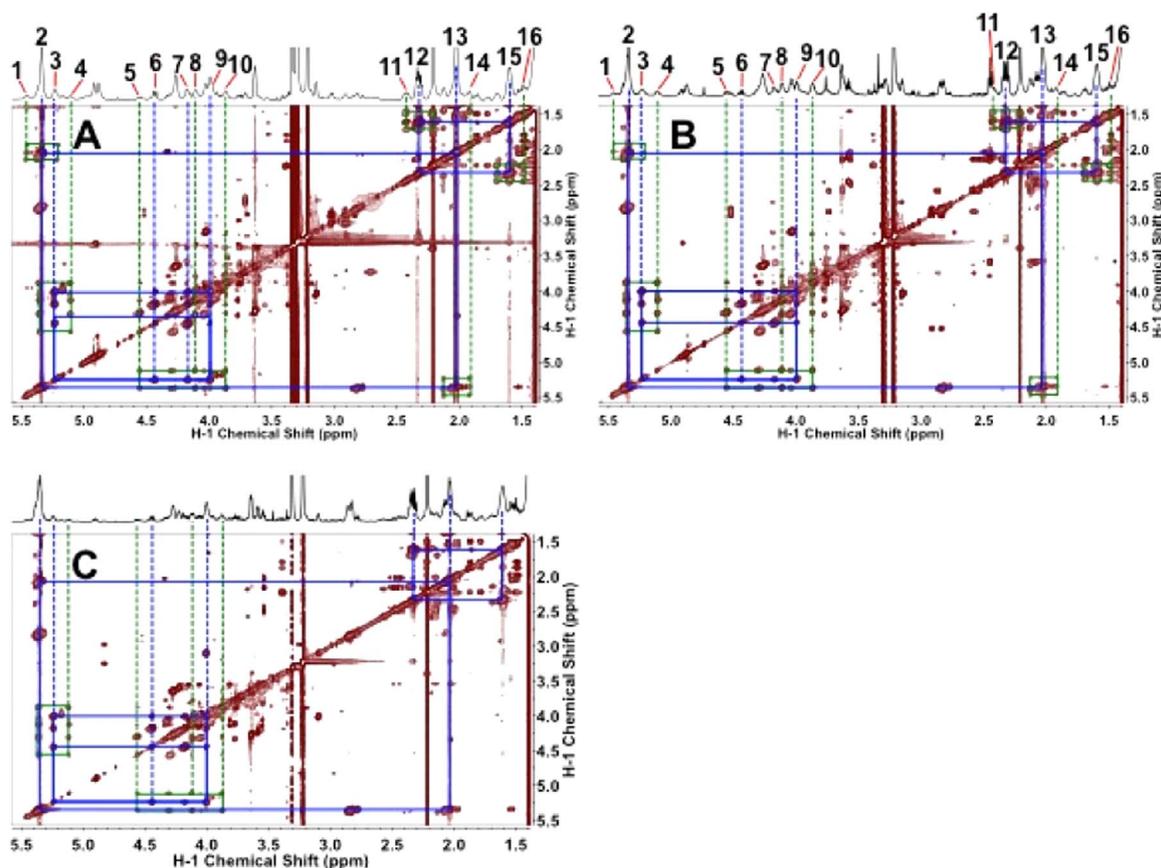


Fig. 7. MDAMB-231 cells synthesize less lipids from glucose than other breast cell lines despite its higher proliferation rate. HMEC (A), MCF-7 (B) and MDA-MB-231 (C) cells were grown for 24 h in the presence of $^{13}\text{C}_6$ -glucose and extracted as described in the Methods. The lipid extracts were dissolved in d_4 -methanol, and TOCSY spectra were recorded at 14.1 T with an isotropic mixing time of 50 ms at 25 °C. Both HMEC (A) and MCF-7 (B) cells showed extensive ^{13}C enrichment (as ^{13}C satellite cross-peaks, green boxes) in the glycerol subunit and fatty acyl chains, which was less in extent for the glycerol subunit and absent for the fatty acyl chains in MDAMB-231 cells (C). Blue boxes denote covalent linkages of protons attached to ^{12}C of the glycerol backbone and fatty acyl chains. 1/3, 2: ^{13}C satellites, ^{12}C -attached unsaturated protons, respectively; 3, 4: ^{12}C -attached, ^{13}C satellite of H2 of glycerol backbone, respectively; 5, 6/7: ^{13}C satellite, ^{12}C -attached H1 of glycerol backbone, respectively; 8/10, 9: ^{13}C satellites, ^{12}C -attached H3 of glycerol backbone, respectively; 11, 12: ^{13}C satellites, ^{12}C -attached H2 of fatty acyl chains, respectively; 13, 14: ^{12}C -attached, ^{13}C satellite of H11 of fatty acyl chains, respectively; 15, 16: ^{12}C -attached, ^{13}C satellite of H3 of fatty acyl chains, respectively.

citrate via the action of ATP-dependent citrate lyase in the cytoplasm. In contrast, the MDAMB-231 cells were significantly ^{13}C labeled only in the glycerol backbone (ca. 25–30% enrichment), despite the much faster cell proliferation rate (Table 1). This suggested an alternative source of fatty acids such as internal lipid droplets.

In addition to glucose, glutamine can be used for lipid synthesis via reductive carboxylation under certain conditions (Frezza, Zheng et al., 2011; Mullen, Wheaton et al., 2011; Yang, Lane et al., 2013) and/or malic enzyme action (Le et al., 2012a, 2012b). Fig. 8B shows the low incorporation of glutamine carbon into the lipid pool, at either the fatty acyl chains or the glycerol backbone in ZR75-1 cells, whereas glucose carbon was extensively incorporated into both subunits. Neither were glutamine carbons significantly incorporated into the lipids of HMEC, MDAMB-231, or MCF-7 cells (data not shown). We estimated from the TOCSY spectra that at most 5% of the C2,3,4 or terminal CH_3 of the acyl chains was derived from $^{13}\text{C}_5$ -Gln, which was much lower than the extent of incorporation of either $^{13}\text{C}_6$ -glucose (ca. 60%) or $^{13}\text{C}_8$ -octanoate carbons (ca. 30%), indicating that glucose or exogenous fatty acids was preferred over Gln for the synthesis of intact lipid. This differed from the case for the free fatty acid pool, where reductive carboxylation has been shown to contribute significantly to the de novo synthesis of this pool under some conditions (Frezza, Zheng et al., 2011; Mullen, Wheaton et al., 2011; Yang, Lane et al., 2013).

Moreover, $^{13}\text{C}_3$ -glycerol was a good substrate for the glycerol backbone of lipids in ZR75-1 cells (^{13}C enrichment =20–25%), but not for the fatty acyl chains, whereas the opposite was observed for

$^{13}\text{C}_8$ -octanoate. The lack of ^{13}C incorporation from $^{13}\text{C}_8$ -octanoate into the glycerol backbone was as expected as fatty acids are not gluconeogenic substrates.

Interestingly, the TOCSY ^{13}C labeling patterns of fatty acyl chains at the ester end $-\text{C}_4\text{H}_2-\text{C}_3\text{H}_2-\text{C}_2\text{H}_2-\text{C}_1\text{O}_2$ in $^{13}\text{C}_8$ -octanoate-treated ZR75-1 cells could not be simply accounted for by direct incorporation or incorporation of the β -oxidation product ($^{13}\text{C}_2$ -acetyl CoA) of this fatty acid into lipids. As shown in Fig. 8D, the ^{13}C satellite cross-peak patterns of H2 (peak 11) and H3 (peak 16) (Lane and Fan, 2007; Lane et al., 2009) revealed not only $^{13}\text{C}_2$ - $^{13}\text{C}_3$ - (●●) but also $^{13}\text{C}_2$ - $^{12}\text{C}_3$ (●●) and $^{12}\text{C}_2$ - $^{13}\text{C}_3$ (●●)-fatty acyl chains. These labeling patterns were similarly observed for H3 and H4 (not shown). With $^{13}\text{C}_8$ -octanoate as the fatty acyl precursor for lipid synthesis, we would expect uniform ^{13}C labeling at C2-4 of fatty acyl chains via direct incorporation, which was inconsistent with the ^1H TOCSY data. The $^{13}\text{C}_2$ - $^{12}\text{C}_3$ and $^{12}\text{C}_2$ - $^{13}\text{C}_3$ -fatty acyl isotopomers could be derived from ^{13}C labeled acetyl CoA via the de novo fatty acid synthesis pathway in which octanoate-derived AcCoA mixes with an unlabeled pool of AcCoA, producing $^{12}\text{C}_1$ $^{12}\text{C}_2$ $^{13}\text{C}_3$ $^{13}\text{C}_4$, $^{13}\text{C}_1$ $^{13}\text{C}_2$ $^{12}\text{C}_3$ $^{12}\text{C}_4$ as well as all ^{13}C , and similarly for the terminal carbons. This then implicated β -oxidation of $^{13}\text{C}_8$ -octanoate into $^{13}\text{C}_2$ -AcCoA. The pattern for C3,C4 however, requires that singly labeled AcCoA is present, which may be derived via the Krebs cycle and malic enzyme activity (Fig. 9).

The fractional enrichment at the C2,3,4 positions of fatty acyl chains derived from $^{13}\text{C}_8$ -octanoate (30%) was significant relative to that derived from $^{13}\text{C}_6$ -glucose (60%), indicating that exogenous fatty

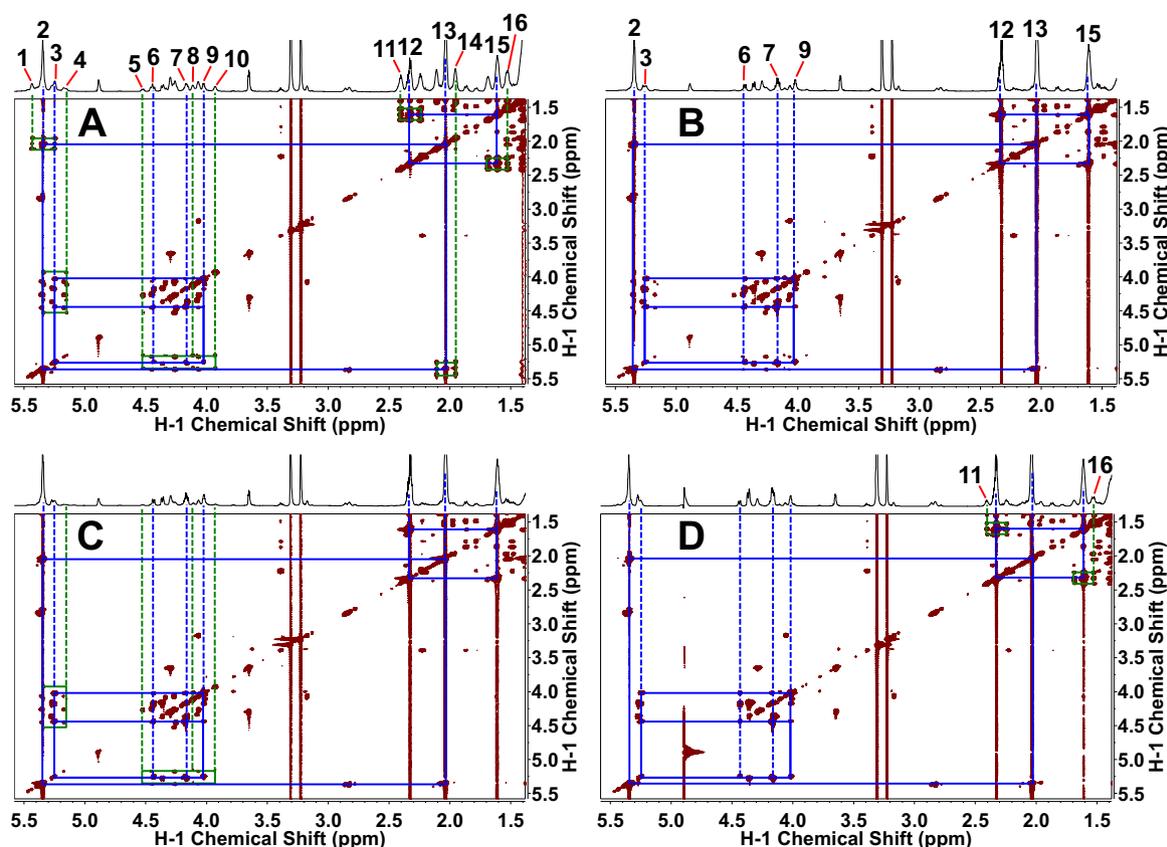


Fig. 8. Differential incorporation of carbon from different sources into phospholipids of ZR-75-1 cells. Cells were grown in the presence of 20% oxygen and $^{13}\text{C}_6$ -glucose (A), $^{13}\text{C}_5$, $^{15}\text{N}_2$ -glutamine (B), $^{13}\text{C}_3$ -glycerol (C) or $^{13}\text{C}_8$ -octanoate (D) for 72 h, and extracted for phospholipids (PL) with methanol. The TOCSY spectra were recorded at 18.8 T, 20 °C. Blue and green boxes respectively denote ^1H connectives between ^{12}C -attached protons and ^{13}C satellites of ^{13}C -attached protons. See Fig. 7 for the assignment of each numbered peaks.

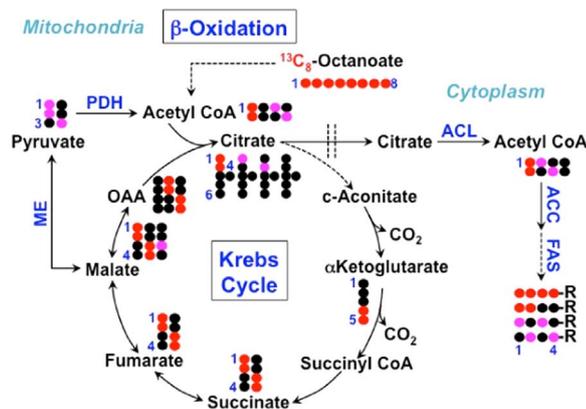


Fig. 9. ^{13}C incorporation from $^{13}\text{C}_8$ -octanoate into fatty acyl chains of lipids in ZR75-1 cells via beta-oxidation and malic enzyme activity. The ^{13}C atom in $^{13}\text{C}_8$ -octanoate is traced into lipids via the reactions of β -oxidation, Krebs cycle, malic enzyme (ME), pyruvate dehydrogenase (PDH), ATP-citrate lyase (ACL), acetyl CoA carboxylase (ACC), and fatty acid synthase (FAS). Double dashed lines delineate mitochondria from the cytoplasm. OAA: oxaloacetate.

acids are good substrates for complex lipid biosynthesis, as has been shown for other cancer cells (Kamphorst et al., 2013). However, it would be difficult to quantitatively compare the contribution of scavenged exogenous $^{13}\text{C}_8$ -octanoate relative to $^{13}\text{C}_6$ -glucose to lipid metabolism with the present data due to lack of knowledge on their respective contribution to β -oxidation.

The same sets of lipid extracts from Fig. 7 were also analyzed by FT-ICR-MS for ^{13}C isotopologues of various lipid species. While NMR analysis provided information on the ^{13}C positional isotopomers of lipids as a whole, it cannot distinguish the labeling patterns of

individual phospholipids. With the high-resolution and accurate mass capability of FT-ICR-MS, a large number of lipids and their ^{13}C isotopologue distribution can be obtained directly from crude lipid extracts (Lane et al., 2009; Higashi, 2011).

As shown in Fig. 10A, the FT-ICR-MS profiling of lipidic extracts of HMEC, MCF-7, and MDAMB-231 cells showed distinct lipid isotopologue distributions for a number of lipid species.

The expanded spectral region denoted by the blue box (Fig. 10B) illustrated in details the ^{13}C isotopologue distribution of PC[32:1] (phosphatidyl choline with 32 total acyl carbons and 1 unsaturation site), where the $^{13}\text{C}_3$ isotopologue (m_3 , m/z 735.568128) along with those containing even (m_{even}) and odd (m_{odd}) numbers (up to 28) of ^{13}C were evident while the monoisotopic or all ^{12}C (m_0) species was absent. This indicated that most of the cellular inventory of PC[32:1] had turned over in all three cell lines. As we have shown previously (Lane, Fan et al., 2009), the m_3 , m_{even} , and m_{odd} isotopologues correspond to glycerolipids with $^{13}\text{C}_3$ -glycerol backbone only, $^{13}\text{C}_2$ -fatty acyl chains, and $^{13}\text{C}_3$ -glycerol backbone + $^{13}\text{C}_2$ -fatty acyl chains when cells are grown in $^{13}\text{C}_6$ -glucose. The isotopologue distributions of this lipid are quite different in the three cell lines, and overall lower ^{13}C incorporation in MDA-MB-231 than in either MCF-7 or HMEC (Fig. S3), which is consistent with the NMR data (Fig. 7).

Similarly, the red box region in Fig. 10C displayed the ^{13}C isotopologues assigned to PS-pmg 40:7+H (MDAMB-231). The m_0 (820.548398 m/z) is at the base of prominent peak (labeled 820.62431 m/z). Up to m_{11} its isotopologues are at the base of the labeled peaks, or not visible at this scale. Starting at 832.58805 m/z , the prominent peaks are the isotopologues. MCF7 is PE 40:7+Na. The m_0 (812.513658 m/z) is at the base of the prominent peak (unlabeled). Up to m_{19} the isotopologues are at the base of the labeled peaks, or not visible at this scale. Starting at 832.58660 m/z , the prominent peaks

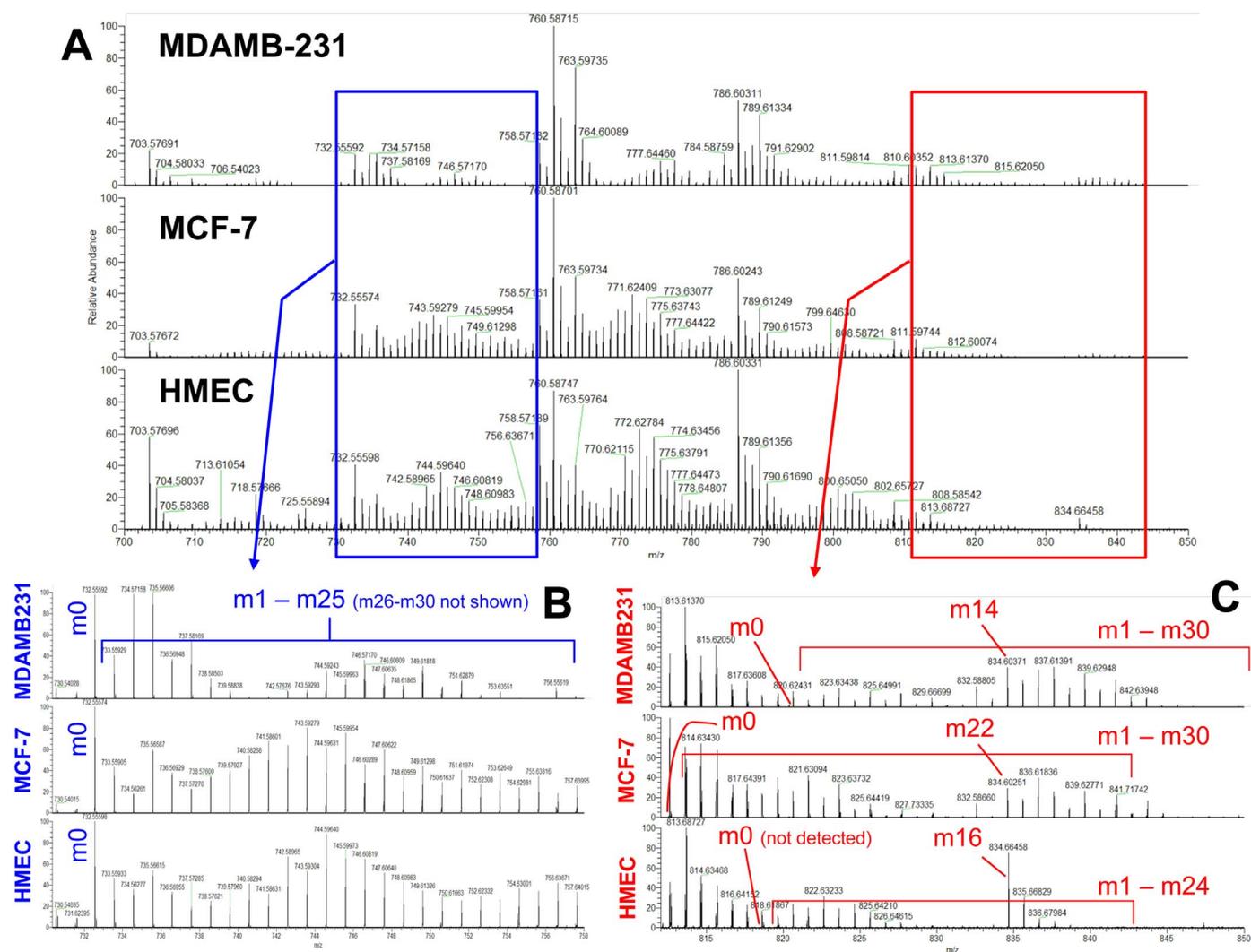


Fig. 10. FT-ICR-MS analysis of lipids extracted from three breast cell lines reveals distinct capacity of $^{13}\text{C}_6$ -glucose in fueling de novo lipid synthesis. Lipids were extracted from cells grown in the presence of $^{13}\text{C}_6$ -glucose and analyzed by FT-ICR-MS as described in the Methods. **A**, the m/z range of MDAMB-231, MCF-7, and HMEC extracts dominated by diacylglycerophospholipids; **B** the expanded m/z range dominated respectively by PC 32:1+H labeled in all 3 cell types. The prominent, labeled peaks are the isotopologues (blue box from **A**); **C**, expansion red box of panel **A**: assignments are as follows: MDA is PS-pmg 40:7+H (820.548398 m/z for m_0); MCF7 is PE 40:7+Na $-m_0$ (812.513658 m/z) is at the base of the prominent peak (unlabeled). HMEC is PC-pmg 40:7+H. The m_0 (818.602868 m/z) was not detected.

are the isotopologues. HMEC is PC-pmg 40:7+H. The m_0 (818.602868 m/z) was not detected. Up to m_{15} the isotopologues are at the base of the labeled peaks, or not visible at this scale. Starting at 834.66458 m/z , the prominent peaks are the isotopologues.

3.5. Metabolic activities traced by $^{13}\text{C}_6$ -glucose in mouse xenografts of ZR-75-1 and MDA-MB-231 cells differed from those *in vitro* but the metabolic differences between the two cell xenografts recapitulate those *in vitro*

Cells in culture may differ metabolically from those *in vivo* due to the influence of 3D cell architecture and/or tumor microenvironment. We therefore performed SIRM analysis in orthotopic mouse xenografts of ZR75-1 and MDAMB-231 cells for comparison with those *in vitro*. Fig. 11A shows representative 1D $^1\text{H}\{^{13}\text{C}\}$ -HSQC spectra of extracts from the xenografts of the two cell lines with $^{13}\text{C}_6$ -glucose introduced as bolus injections via the tail vein (Lane, Yan et al., 2015). The xenografts of the two cell lines showed large metabolic differences (Fig. 11A), e.g. abundance of ^{13}C -lactate (Lac), -Gln, and -glycogen was enhanced in the ZR75-1 over MDAMB-231 xenografts, while that of

^{13}C -Ala, -Glu, succinate, -Asp, -Gly, as well as the ribosyl subunit of AXP and UXP showed the opposite trend. These data were consistent with heightened glycolysis and glycogen metabolism but reduced Krebs cycle, Gly synthesis, as well as PPP and/or nucleotide biosynthesis in ZR75-1 versus MDAMB231 tumors (Fig. 11B, Table 2). These metabolic differences in the two tumor xenografts largely recapitulated those in the corresponding cell lines *in vitro* (Fig. 11B, Table 2). On the other hand, there were large differences between *in vivo* and *in vitro* glucose metabolism in individual cell lines. For example, the abundance ratios among ^{13}C -3-lactate, ^{13}C -1'-AXP, ^{13}C -1'-UXP, and ^{13}C -4-Glu were dramatically different between *in vivo* and *in vitro* conditions for both ZR75-1 (cf. black lines in Fig. 11A,B) and MDAMB-231 (cf. red lines in Fig. 11A,B) cells. These differences presumably reflect the influence of tumor architecture or TME on tumor cell metabolism.

4. Discussion

The breast cancer cells investigated had wildly different growth rates in culture with doubling times ranging from 18 to 20 h for the aggressive triple negative MDA-MB-231–80 h for the estrogen sensi-

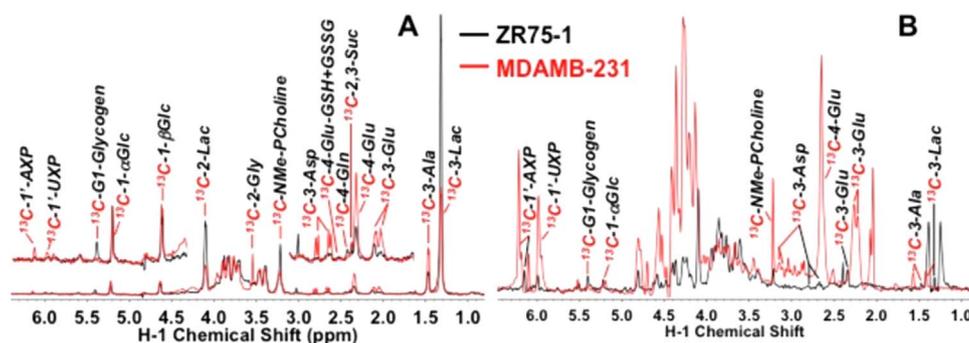


Fig. 11. $^{13}\text{C}_6$ -glucose transformations in ZR75-1 and MDAMB-231 cells as mouse xenografts show similar metabolic distinctions as observed in vitro. Orthotopic tumors were grown from ZR75-1 or MDAMB-231 cells as described in the Methods. Mice were treated with 20 mg each $^{13}\text{C}_6$ -glucose via three tail vein injections at a 15-min interval (Lane, Yan et al., 2015). The tumors were harvested, polar metabolites extracted, and analyzed by 1D $^1\text{H}\{^{13}\text{C}\}$ -HSQC at 14.1 T and 20 °C in **A**. ZR75-1 and MDAMB231 cells in **B** were cultured in DMEM medium containing 0.1% $^{13}\text{C}_6$ -glucose for 24 h before extraction of polar metabolites with 10% trichloroacetic acid (MDAMB231) or 60% acetonitrile (ZR75-1) and 1D HSQC analysis as described in Methods. Some of the metabolites in **B** such as lactate (Lac), Ala, Glu, Asp, and adenine nucleotides (AXP) displayed different chemical shifts between the extracts of the two cell lines due to their pH difference.

tive ZR75-1 line (cf. Table 1). The rate of cell growth is determined by numerous factors, but a common requirement for cell doubling is the uptake of different nutrients to support both energetic and anabolic demands from growth such as macromolecular biosynthesis. Here, we demonstrated the use of different ^{13}C -labeled substrates coupled with NMR and FT-ICR-MS analysis to probe the fate of these substrates in a primary breast and three breast cancer cell lines varying in growth rates. The methodologies revealed the differential fate of various substrates transformed through central metabolic pathways that are essential for energy and biomass production. Although preliminary, the findings suggested some notable aspects of breast cancer cell metabolism for further investigations.

For example, glycolytic capacity as estimated from $^{13}\text{C}_6$ -glucose-derived lactate production and release to the media (Table 2), did not appear to be always the key to determining the rate of breast cancer cell proliferation, as ZR75-1 cells had higher capacity than the faster growing MCF-7 and MDAMB-231 cells (cf. Table 1, 2). Similar observations have previously been reported in other systems (Jain et al., 2012; Dolfi, Chan et al., 2013). It should be noted that the medium lactate production was a proxy measure of glycolytic capacity, and did not take into account the contribution of intracellular fates of glycolytic pyruvate, although the latter constitutes only a small fraction of the total pyruvate derived from glucose in cancer cells (data not shown; Fan et al., 2008; Le et al., 2012a, 2012b; Dong et al., 2013).

We also found that glucose was by far the preferred source of nucleotide ribose produced via PPP in the breast cancer cell lines studied, as the ^{13}C enrichment in the ribose subunit of the free nucleotide pool was high with $^{13}\text{C}_6$ -glucose as the source. Breast cancer cells (MDA-MB-231 and MCF-7) appeared to favor ribose synthesis via the oxidative branch of PPP, thereby leading to more NADPH production, relative to the primary HMEC cells. Different types of cells use widely different ratios of the oxidative and non-oxidative branches of the PPP from mainly oxidative (Lee, Boros et al., 1998; Centelles et al., 2007; Yang, Lane et al., 2013) to almost completely non-oxidative (Boros et al., 1997; Ying et al., 2012) or more evenly balanced (Boren et al., 2001; Vizan et al., 2005; Kominsky et al., 2009).

Although anaplerosis (e.g. pyruvate carboxylation (Sellers et al., 2015)) and glutaminolysis (DeBerardinis and Cheng, 2010; Ochoa-Ruiz and Diaz-Ruiz, 2012) is expected to be activated in cancer cells due to growth demand, PC activation appeared to be more closely associated with breast cancer cells than enhanced glutaminolysis, as the latter fueled uracil ring synthesis more extensively in HMEC than MCF-7 cells (cf. Table 4). This is consistent with a recent report that PC was overexpressed in cancerous versus non-cancerous breast cells (Phannasil et al., 2015). Glutaminolysis also appeared to be an

insignificant source for phospholipid biosynthesis in breast cancer or primary breast cell lines but glucose, glycerol and octanoate were good substrates for new membrane lipid production. We further noted that phospholipid synthesis from octanoate appeared to be substantially mediated via β -oxidation, as opposed to direct incorporation via acyl chain elongation. Although contorted, the β -oxidation route could serve the purpose of generating energy and reducing equivalents, which are also required for lipid synthesis, in addition to producing the acetyl CoA precursor for the synthesis of fatty acyl chains. Finally, glucose transformations through the central pathways in ZR75-1 or MDAMB-231 cells appeared to be influenced by the tumor architecture or microenvironment but the metabolic distinctions between the two cell lines appeared to be maintained from in vitro cultures to in vivo xenografts.

5. Conclusions

In conclusion, by employing different stable isotope tracers and stable isotope-resolved metabolomics (SIRM) approaches, we demonstrated the differential use of $^{13}\text{C}_6$ -glucose, ^{13}C -1/2-glucose, $^{13}\text{C}_5$, $^{15}\text{N}_2$ -Gln, $^{13}\text{C}_3$ -glycerol, and $^{13}\text{C}_8$ -octanoate by different human breast cell lines via glycolysis, PPP, the Krebs cycle, nucleotide biosynthesis, and lipid turnover pathways. Although preliminary, we found that glycolysis was not strongly associated with the rate of breast cancer cell proliferation, glutaminolysis did not support lipid synthesis in primary breast or breast cancer cells but contributed extensively to pyrimidine ring synthesis in all cell types, anaplerotic pyruvate carboxylation was activated in breast cancer versus primary cells, and glucose metabolism in individual breast cancer cell lines could be influenced by tumor architecture/microenvironment but not the metabolic distinctions between the cell lines.

The quantitative metabolic differences between cell lines are very clear also in the orthotopic xenografts. The uptake and utilization of glucose and glutamine is quantitatively different in the two xenografts. The metabolic reprogramming that occurs indicates that there may be multiple solutions to the demands of cell proliferation. In these studies we have shown that ER⁺ and triple negative cells have quite different metabolic phenotypes.

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Appendix A. Supporting information

Supplementary data associated with this article can be found in the online version at doi:10.1016/j.ymben.2017.01.010.

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