Metabolic profiling of cell growth and death in cancer: applications in drug discovery

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Metabolic profiling using stable-isotope tracer technology enables the measurement of substrate redistribution within major metabolic pathways in living cells. This technique has demonstrated that transformed human cells exhibit profound metabolic shifts and that some anti-cancer drugs produce their effects by forcing the reversion of these metabolic changes. By revealing tumor-specific metabolic shifts in tumor cells, metabolic profiling enables drug developers to identify the metabolic steps that control cell proliferation, thus aiding the identification of new anti-cancer targets and screening of lead compounds for anti-proliferative metabolic effects.

Metabolic profiling of tumor cells: tools and applications

The excess accumulation of the $^{18}$Fluor tracer attached to deoxyglucose is a reliable indicator of increased metabolic activity in tumor cells, which also correlates with malignancy, growth rates and response to therapy [4,5]. Although indispensable as a diagnostic tool, this imaging technique does not permit the detailed characterization of the destinations or routes taken by glucose carbons in the macromolecule and energy producing metabolic reactions. However, with the use of mass spectrometry (MS) and glucose molecules labeled with stable (non-radiating) isotope ($^{13}$C), the distribution of labeled carbons in various intermediates during de novo macromolecule synthesis in cancer cells can be revealed. Metabolic profiling is designed to uncover detailed substrate-flow modifications in response to pathological processes or new
anti-tumor therapies. Here we discuss the specific application of [1,2-13C]glucose in metabolic profiling. The changing pattern of distribution of 13C from [1,2-13C]glucose in intracellular metabolic intermediates provides a measure of carbon flow towards the pentose cycle, glycolysis, direct glucose oxidation, the tricarboxylic acid (TCA) cycle and fatty acid synthesis, simultaneously. Metabolic profiling reveals specific flux changes in lactate, glutamate, nucleic acid ribose, palmitate and CO2 during oncogenesis and during anti-proliferative treatments. Thus, it indicates major changes in glucose utilization for macromolecule synthesis in cancer, information that can also be used for drug target development.

Rationale for 13C labeling
In general, [1,2,13C2]glucose metabolism produces two isotope-labeled intermediary metabolite species (also called mass isotopomers): m1, with one 13C substitution, and m2, with two 13C substitutions. These isotopomers are readily separated and measured using gas chromatography–mass spectrometry (GC–MS) techniques described elsewhere [6–9].

Lactate is the main three-carbon product of glycolysis and is readily secreted into the cell culture medium; therefore, it can be used to measure label incorporation into the three-carbon metabolite pool. The possible arrangements of 13C labels from [1,2,13C]glucose to lactate through glycolysis are shown in Fig. 1 and Fig. 2. Glucose oxidation through the pentose cycle, however, results in a loss of the first 13C of glucose (shown in Fig. 3). 13CO2 is also released during glucose oxidation, which reflects glucose utilization for energy production in the pentose and TCA cycles. During metabolic profiling we determine not only the amount of 13C isotope accumulation but also the positions of 13C-labeled carbons within lactate. It is easy to see that the ratio between m1 (recycled lactate from oxidized glucose via the oxidative branch of the pentose cycle) and m2 (lactate produced by the Embden–Meyerhof–Parnas glycolytic pathway) is indicative of the activity of G6PD and glucose recycling in the pentose cycle. A detailed description of the reactions and calculations can be found elsewhere [6]. Anti-cancer drug treatment that affects direct glucose oxidation or glycolytic flux is expected to alter glucose-label rearrangement in lactate.

Ribose and deoxyribose are the building blocks of nucleotides and, therefore, 13C incorporation from glucose into RNA ribose or DNA deoxyribose indicates changes in nucleic-acid synthesis rates through the respective branches of the pentose cycle. Singly labeled ribose molecules on the first carbon position (m1) represent ribose that is produced by direct glucose oxidation through G6PD (Fig. 3). This ribose can either be incorporated into nucleic acid or returned to glycolysis as shown in Fig. 4. The alternative pathway for ribose synthesis is through the non-oxidative steps of the pentose cycle using glycolytic metabolites. The non-oxidative synthesis of ribose from glucose is controlled by transketolase as shown in Fig. 5. There is

1. Possible rearrangements of 13C in various metabolites of glycolysis using [1,2-13C]glucose as the single tracer. Glucose activation via hexokinase/glucokinase and the formation of fructose-1,6-bis-phosphate maintain the 13C-labeled carbons in the 1st and 2nd positions. 13C-labeled carbon positions derived from [1,2-13C]glucose are red, whereas 12C native-labeled carbon positions are black. During oncogenesis there is a large increase in glucose-carbon entry into transforming cells, which can be detected by an increase in the glycolytic flux towards lactate and nucleotides in cells treated with isofenphos or transforming growth factor-β2 (TGF-β2). GleevecTM inhibits hexokinase and glucose entry into leukemia cells at one of its metabolic target sites.
Figure 2. Formation of [2,3-13C]lactate through the Embden–Meyerhoff–Parnas pathway. The production of three-carbon metabolites by aldolase, glyceraldehyde and dihydroxyacetone phosphates transfers the labeled carbons into the 2nd and 3rd positions of glyceraldehyde. There are no subsequent positional changes in terms of 13C labeling by triose phosphate isomerase in the three-carbon metabolite pool that undergoes glycolysis, resulting in the release of lactate. Oncogenesis increases lactate production from glucose in all transformed cells, which can be detected as an increase 13C labeling in lactate in the medium. The M2 isoform of pyruvate kinase inhibits glycolysis but expands the phosphometabolite pool for nucleic acid synthesis.

Figure 3. The rearrangement of 13C in pentose cycle metabolites resulting from direct glucose oxidation. The loss of the first labeled carbon of glucose resulting from direct oxidation produces ribulose molecules that are labeled only on the first position with 13C. During the oxidation of glucose, 13CO2 is released, which can easily be detected using isotope ratio mass spectrometry (IRMS). Reducing equivalent NADP+ is also produced that can be used in lipid synthesis, DNA nucleotide production or to maintain reductive–oxidative reactions throughout metabolism. New anti-cancer treatment modalities such as Gleevec™ and Avemar™ primarily target glucose oxidation and ribose synthesis in the pentose cycle by decreasing G6PD and glucose carbon flow towards nucleic acid synthesis.
Figure 4. [1-13C]Ribose-5-P formation in the non-oxidative pentose cycle after glucose oxidation. The non-oxidative steps of the pentose cycle generate several intermediates that can be used for nucleic acid synthesis (ribose-5-P, as seen in proliferating cells) or recycled back to glycolysis (glyceraldehydes-P and fructose-P, as seen in non-proliferating, resting cells).

Figure 5. The formation of [1,2-13C]ribose through the non-oxidative reactions of the pentose cycle. Rapidly proliferating tumor cells are able to synthesize ribose-5-P via non-oxidative pentose cycle reactions in which thiamin (vitamin B1) functions as the necessary co-factor of transketolase. This process enables the unrestrained production of ribose-5-P in tumor cells, independent of available NADP, a phenomenon observed in response to isofenphos pesticide or transforming growth factor-β2 (TGF-β2) treatment in transforming cells. Increased non-oxidative synthesis of ribose from glucose deprives tumor cells of reducing compounds. Although this gives rise to great cell-proliferating potential, reductive synthesis, differentiation, normal cell morphology and functions are diminished. Both the wheatgerm product, AvemarTM, and the soybean phytochemical, genistein, inhibit transketolase and thereby inhibit carbon flow through the non-oxidative steps of the pentose cycle as their primary mechanism of anti-proliferative action.
no net carbon-loss throughout the non-oxidative steps of the pentose cycle; therefore, ribose molecules labeled on the first two carbon positions with $^{13}$C ($m_2$) represent nucleic acid ribose synthesis through the non-oxidative route [6]. The ratio between $m_1$ and $m_2$ of nucleic acid ribose and deoxyribose closely reflects the involvement of glucose oxidation and non-oxidative ribose synthesis in tumor cells. These reactions are effectively modulated by novel and effective cancer treatment modalities during de novo nucleic acid synthesis and cell growth, as described later.

$^{13}$CO$_2$ release is a reliable marker of glucose oxidation (Fig. 3). $^{13}$CO$_2$ production from $[1,2-^{13}$C$]$glucose takes place in both the pentose and TCA cycles and is measured as part of the metabolic profiling process to determine the rate of glucose oxidation in response to anti-cancer therapies. Decreased glucose oxidation with increased glucose uptake is always a reliable sign of increased anabolism, as seen in transformed cells.

Glutamate, a non-essential amino acid, is partially produced from mitochondrial $\alpha$-ketoglutarate, which is a central intermediate of the TCA cycle. Glutamate is readily released into the culture medium after synthesis, which represents one of the routes for glucose carbon utilization.

Therefore, label incorporation from glucose into glutamate is a good indicator of TCA cycle anabolic metabolism for amino acid synthesis instead of glucose oxidation (Fig. 6) [7,8]. Surprisingly, cell-transforming agents and anti-cancer treatments only weakly influence TCA cycle carbon flow as demonstrated by unaltered glutamate $^{13}$C accumulation from glucose in tumor cell cultures.

Fatty acid synthesis is also strongly dependent on glucose carbons through the formation of acetyl-CoA via pyruvate dehydrogenase. The incorporation of $^{13}$C from $[1,2-^{13}$C$]$glucose gives key information about the fraction of de novo lipogenesis in tumor cells and about glucose carbon contribution to acetyl-CoA for fatty acid synthesis (Fig. 6) [9]. Almost all cancer treatment modalities alter fatty acid synthesis, and changes in the flow of carbon toward fatty acid synthesis are important in tumor growth control.

Studying metabolic profiles in response to cell-transforming agents or cancer growth-controlling compounds using stable isotopes in cancer cell cultures or in vivo, can reveal how the growth signaling and metabolic processes are linked and to what extent metabolic pathway flux influences cell growth. Effective anti-cancer therapeutics are
expected to limit carbon flow towards nucleic acid synthesis and shift glucose toward oxidation or fatty acid synthesis. These changes can easily be revealed by metabolic profiling, making it an excellent tool for screening potential new drugs to treat cancer. Examples of how metabolic profiles change in cells, how cancer therapeutics reverse them, and how metabolic profiling can reveal both types of change as they happen, are provided in the next section.

**Increased pentose cycle carbon flow and cell transformation**

Cancer progression is enhanced by the autonomous growth promoting tyrosine kinase signaling ligand, transforming growth factor-β2 (TGF-β2) [10]. This process primarily depends on non-oxidative glucose conversion into ribose as the end-result of this signaling pathway [11]. Similarly, the carcinogen pesticide isofenphos directs glucose carbon-flow towards nucleic acid ribose synthesis in myeloid cells, resulting in a proliferative phenotype [12]. As depicted in Table 1, cell-transforming agents uniformly induce carbon-flow changes consistent with increased pentose cycle metabolism. The primary direction of glucose carbon flow in transformed human cells is toward nucleic acid ribose synthesis. By contrast, decreased carbon flow is observed towards amino acid and fatty acid synthesis pathways. The phenotypic consequences of this include rapidly proliferating, poorly differentiated cells with aneuploidy.

This increased carbon flow towards nucleic acid synthesis requires the unremitting expansion of six, five and three-carbon phospho-metabolite pools. This is expedited by the oncogenic expression of the dimer M2 isoform of pyruvate kinase (M2PK) [13]. The oncogenic transition lowers the affinity of substrate phosphoenolpyruvate for pyruvate kinase, thus decreasing glycolytic flux but expanding all glucose phosphate intermediary metabolites in tumor cells that promote nucleotide synthesis (Fig. 2; Table 1). The expression of M2PK has consistently been observed in kidney [14], lung [15], gastrointestinal [16], and breast malignancies [17], indicating the presence of malignant cells with sufficiently high specificity and sensitivity that it is now recommended as a reliable tumor marker.

**Decreased pentose cycle carbon-flow as a cell growth controlling mechanism**

Oncogenic transformation of myeloid cells in chronic myeloid leukemia (CML) results from the expression of a constitutively active tyrosine-kinase signaling protein construct, generated by the re-alignment of the breakpoint cluster region and Ableson leukemia virus proto-oncogene sequences (Bcr/Abl) [18]. This construct stimulates glucose transport in multipotent hematopoietic cells [19]. The inhibition of the Bcr/Abl tyrosine kinase by the anti-cancer drug, STI571 (Gleevec™), has been shown to effectively inhibit glucose utilization towards nucleic acid synthesis and leukemia cell proliferation [20]. At doses comparable to those used in the treatment of myelogenous leukemia, STI571 suppresses hexokinase and G6PD activities in K562 myeloid leukemia cells. As a result, STI571 limits pentose cycle carbon-flow towards nucleic acid ribose synthesis, as depicted in Table 2.

Decreased glucose carbon-flow towards nucleic acid synthesis has also been observed in cancer cells after treatment with other agents, including phytochemicals (Avemar™, genistein) [21,22] and natural hormones such as dehy-

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**Table 1. Metabolic profiles during carcinogenesis**

<table>
<thead>
<tr>
<th>Transforming agent</th>
<th>Target pathways</th>
<th>Metabolic profile</th>
<th>Phenotype</th>
<th>Ref.</th>
</tr>
</thead>
<tbody>
<tr>
<td>Transforming growth factor b2</td>
<td>Pentose cycle, glycolysis, TCA cycle</td>
<td>Increased glucose carbon flow through the non-oxidative pentose cycle; decreased glycolysis and glucose oxidation</td>
<td>Poorly differentiated lung carcinoma</td>
<td>[11]</td>
</tr>
<tr>
<td>Isofenphos organophosphate pesticide</td>
<td>Pentose cycle, TCA cycle, fatty acid synthesis</td>
<td>Increased glucose carbon flow through the non-oxidative pentose cycle; severely diminished fatty acid synthesis and glucose oxidation</td>
<td>Rapidly progressing leukemia</td>
<td>[12]</td>
</tr>
<tr>
<td>Bcr/Abl tyrosine kinase oncogene (leukemia)</td>
<td>Glucose phosphorylation</td>
<td>High increase in glucose intake resulting from the expression of a high affinity glucose transporter GLUT-1</td>
<td>Highly proliferative, differentiated</td>
<td>[19]</td>
</tr>
<tr>
<td>M2 isoform pyruvate kinase</td>
<td>Glycolysis</td>
<td>Decreased glycolytic flux, increased levels of glucose–phosphate intermediates available for nucleotide precursor synthesis</td>
<td>Transformed, highly proliferative</td>
<td>[13]</td>
</tr>
</tbody>
</table>

Abbreviation: TCA, tricarboxylic acid.
droepiandrosterone sulfate (DHEA–S) [23] (Table 2). Because ribose is a structurally similar metabolite of glucose and ribose nucleotides are essential for de novo DNA and RNA synthesis, it is evident that metabolic profiling using specifically labeled glucose isotopes will have far reaching applications in the discovery of anti-proliferative drugs. Metabolic profiling has been much appreciated for its role in uncovering the leukemic effect of anti-cholinesterases by revealing what happens metabolically when cells shift from a normal to a tumorigenic cell cycle [24]. It is rather surprising that the TCA cycle is not a primary target of the cell transformation process [11] and anti-cancer modalities. Treatments that effectively limit carbon flow in the pentose cycle do not induce the same effect in the TCA cycle [21,22].

**Metabolic control coefficients in metabolic profiling**

It is evident that high levels of pentose cycle enzymes are associated with cell aging, uncontrolled cell proliferation and prolonged cell survival [25]. Pentose cycle enzymes provide the necessary ribose substrate for de novo nucleic acid synthesis as well as the reducing compound NADP⁺ for deoxyribose and fatty acid syntheses. A shortage in glucose carbon flow towards nucleic acid synthesis, as well as decreased NADP⁺ production, are strong metabolic signs of cell cycle withdrawal and apoptosis in rapidly dividing cells [26,27] (Table 2). To understand why pentose cycle enzymes have such a strong influence on cell physiology and how they control cell growth and transformation, one needs to consider the concept of metabolic control analysis (MCA). MCA provides a quantitative description of substrate flux in response to changes in various system parameters in complex enzyme systems [28]. Therefore, MCA and metabolic profiling are closely related fields, because carbon flow changes are the combined results of enzyme activity changes and substrate availability and redistribution.

In MCA, the control exerted over substrate flux or any systemic parameter (e.g. cell proliferation) can be quantitatively described as a control coefficient for each and every enzyme in a metabolic network. Pentose cycle enzymes have been characterized in terms of their flux control coefficients in various mammalian cells, including tumor cells. The growth control coefficients of G6PD and transketolase in the Ehrlich’s tumor model were recently reported to be high [29] and these enzymes are ranked as new promising anti-cancer drug targets [30]. The expanded understanding of crucial proliferative processes provided by MCA and metabolic profiling make it clear that target metabolic enzymes for new anti-cancer therapies have to be those that are demonstrated to have high control coefficients to limit substrate flow for nucleic acid ribose synthesis. This is, of course, also a crucial criterion in drug development efforts in which the efficacy of potential anti-proliferative drugs is determined by metabolic screening.

**Applying metabolic profiling in drug discovery**

Current drug discovery places heavy emphasis on finding new anti-cancer compounds that work by interfering with cell growth by targeting specific signal transduction pathways or genes. The use of metabolic profiles in the drug discovery process enables the determination of the crucial enzymatic steps that control carbon flow into proliferation-

<table>
<thead>
<tr>
<th>Treatment</th>
<th>Target pathways</th>
<th>Metabolic profile</th>
<th>Phenotype</th>
<th>Ref.</th>
</tr>
</thead>
<tbody>
<tr>
<td>Gleevec (STI571) (Bcr/Abl tyrosine kinase inhibitor)</td>
<td>Glucose intake, pentose cycle, fatty acid synthesis</td>
<td>Decreased glucose intake and carbon flow through the oxidative pentose cycle; decreased fatty acid synthesis; inhibitor of hexokinase and G6PD</td>
<td>Decreased cell proliferation</td>
<td>[20]</td>
</tr>
<tr>
<td>Genistein (soy bean phytochemical)</td>
<td>Pentose cycle, fatty acid synthesis</td>
<td>Decreased glucose intake and carbon flow through the non-oxidative pentose cycle; decreased fatty acid synthesis</td>
<td>Apoptosis</td>
<td>[21]</td>
</tr>
<tr>
<td>AVEMAR (fermented wheat germ extract; G6PD and transketolase inhibitor)</td>
<td>Pentose cycle, fatty acid synthesis</td>
<td>Decreased glucose intake and carbon flow through the non-oxidative pentose cycle; increased fatty acid synthesis</td>
<td>Decreased proliferation; cancer patients gain weight</td>
<td>[22]</td>
</tr>
<tr>
<td>DHEA–S(G6PD inhibitor)</td>
<td>Pentose cycle</td>
<td>Decreased oxidative pentose cycle flux</td>
<td>G1 cell cycle arrest</td>
<td>[23]</td>
</tr>
<tr>
<td>Oxythiamine (transketolase inhibitor)</td>
<td>Pentose cycle</td>
<td>Decreased non-oxidative pentose cycle flux</td>
<td>G1 cell cycle arrest</td>
<td>[23,31]</td>
</tr>
</tbody>
</table>

Abbreviation: DHEA–S, dehydroepiandrosterone sulphate; G6PD, glucose-6-phosphate dehydrigenase.
related macromolecules. It is possible, using metabolic profiling, to identify new targets for anti-cancer compounds that selectively disrupt the unique metabolic networks of cancer cells. Our previous studies have mainly focused on glucose metabolic enzymes including hexokinase, G6PD and transketolase. Other potential targets remain to be explored with the notion that advanced, therapy-resistant tumor growth probably depends on constitutively active metabolic networks, which can be reached only by using drugs that inhibit metabolic enzymes. A combined approach of studying signaling, genetic and metabolic events on the same bench enables us to better define the metabolic processes of cancer cell growth and death. Using such an approach, a much larger set of anti-cancer compounds could be screened according to their signaling properties and metabolic profiles during the industrial drug development process.

The need for metabolic profiling using stable isotope-labeled substrates is demonstrated by the fact that although molecular genetic studies can anticipate changes in metabolism, they can not fully reveal whether metabolic network enzymes with strong control properties are active and their substrates abundantly present.

Conclusion
Metabolic profiling provides vital information beyond the reach of signal transduction and genetic studies, showing whether the adjustments in carbon flow and pentose cycle metabolism that are essential for rapid cell proliferation are taking place. Furthermore, the use of metabolic profiling to both identify crucial targets and fully establish whether a candidate anti-cancer drug actually produces a growth-limiting effect makes molecular profiling a valuable new tool in the efficient development of effective mechanism-based anti-cancer drugs.

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