



What Applied Physical Chemistry Can Contribute to Understanding Cancer: Toward the Next Generation of Breakthroughs

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Abstract: Living systems, whether healthy or diseased, must obey the laws of chemistry. The purpose of this review is to identify the interpretive limits of cellular biochemistry using, largely, the tools of physical chemistry. We illustrate this approach using two major concepts in cancer: carcinogenicity and cancer recurrences. Cells optimize the chemical performance of enzymes and pathways during cancer recurrences. Biology has been primarily concerned with the analysis of high affinity interactions, such as ligand-receptor interactions. Collective weak interactions (such as van der Waals forces) are also important in determining biosystem behaviors, although they are infrequently considered in biology. For example, activity coefficients determine the effective concentrations of biomolecules. The in vivo performance of enzymes also depends upon intracellular conditions such as high protein concentrations and multiple regulatory factors. Phase separations within membranes (two dimensions) and nucleoli (three dimensions) are a fundamental regulatory factor within cells, as phase separations can alter reactant concentrations, local dielectric constants, and other factors. Enzyme agglomeration also affects the performance of biochemical pathways. Although there are many examples of these phenomena, we focus on the key steps of cancer: carcinogenicity and the biochemical mechanism of cancer recurrences. We conjecture that oxidative damage to histones contributes to carcinogenicity, which is followed by nucleolar phase separations and subsequent DNA damage that, in turn, contributes to the redistribution of enzymes mediating metabolic changes in recurrent breast cancer.

Keywords: chemical adducts; carcinogenicity; breast cancer recurrences; metabolism; machine learning; enzyme clustering and agglomeration

1. Introduction

In the 1950s, Watson and Crick, who were specialists in virology and physics, respectively, deduced the structure of DNA based upon the x-ray crystallography of DNA samples. Their work led to the "central dogma of molecular biology," which laid the foundation for the field of molecular biology. This work illustrates the power of interdisciplinary research. The broad direction of life science research was summarized by Crick: "the ultimate aim of the modern movement in biology is in fact to explain all biology in terms of physics and chemistry [1]." This approach has been enormously successful and should continue [2]. Yet, due to the organization of scientific administration (grant committees, promotion and tenure committees, etc.) [3], research remains predominantly within silos; and these silos can become divorced from other fields, including physical chemistry and cancer research.

Cells must obey the laws of physical chemistry, but is anyone checking? Not really. For example, the medical literature is filled with articles about the oxidant superoxide, but superoxide anions are rarely an oxidant. Superoxide oxidizes certain Fe-S containing proteins such as succinate dehydrogenase and NADH (reduced nicotinamide adenine dinucleotide)-ubiquinone oxidoreductase [4,5]. Its protonated form, the hydroperoxide



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Copyright: © 2023 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). radical, is a dangerous oxidant, but only at low pH values [5] (pKa = 4.88). As membrane surfaces are negatively charged, proton concentrations are higher and therefore, hydroperoxide radicals become more abundant [6]. As hydroperoxide radicals are uncharged and enter cell membranes [6], they likely contribute to the cell damage attributed to superoxide anions. Hydroperoxide radicals promote the lipid peroxidation pathway. Superoxide anions are in general better reductants than oxidants [7]. Although superoxide is not an oxidant, it interacts with other species to form downstream oxidative radicals. Superoxide reactivity is an example of research performed in a silo. On the other hand, research has shown that most Nobel Prizes in physiology or medicine go to scientists performing inter-disciplinary research [8]. For example, the 2012 Nobel Prize in Chemistry was awarded to Lefkowitz and Kobika, two biologists. Impactful work defies silos.

The aim of this review is to present applications of established physical–chemical knowledge in new biological settings, to bridge the silos, with the goal of gaining a better understanding of the biogenesis and detection of cancer and to encourage new research in the quantitative chemistry of cancer.

2. Re-Visiting a Few Basic Chemical Principles in a Cellular Context

Enzymatic reactions are typically studied in vitro, or outside an organism, using monodisperse, highly diluted near ideal solutions in isotropic and well-defined environments. However, living cells are just the opposite—highly anisotropic structures that often display compartmentalization at several levels. The reactants contained in these compartments are far from equilibrium and ideality. Whether or not in vitro findings have substantial relevance to living matter is uncertain. As a rule, it is best to be cautious and to carefully consider the limitations of experimental findings. In this section, we will apply basic concepts in physical chemistry to cells, especially cancer cells. Some of these concepts are summarized in Table 1, then applied in Sections 3 and 4.

	Influence Type	Selected Types and Examples ²
Local Environment	рН	PFK
	Redox Condition	Oxidative, Reductive
	Ionic Condition	Potassium, Calcium
	Dielectric Constant	Active sites, LLPS
	Electrostatic	Nucleosomes and other binding events
Chemical	Concentration	Activity coefficient, effective concentration
	Isoform switching	PFK
	Phosphorylation	Signaling, enzyme, and transport molecules
	Solubility	Proteins, metabolites
	Low affinity binding sites	Asp-Asp-Thy-Glu-Asp sequences
	High affinity binding sites	Ligands, cofactors, ATP, GTP, Allosteric factors, ubiquitination, prenylation, etc.
Emergent Behaviors	Hydrotropes	ATP, GTP, and other amphipathic molecules
-	Phase separations	Two and three dimensional
	Feedback	Positive and negative
	Translocation	Microfilaments and microtubules
	Assembly state	Monomer, oligomer, mixed oligomers, clusters, metabolons, metabolic platforms

Table 1. Physical and Chemical Influences on Enzyme and Pathway Performance in Cancer¹.

¹ Chemical performance and clinical outcomes depend upon complex combinations of these several factors.

² These are representative, not exhaustive.

2.1. Concentration

One of the most useful concepts in in vitro biochemistry is biomolecule concentration. It is also one of the most difficult concepts to properly apply in cellular biochemistry. Let us consider the question of intracellular adenosine triphosphate (ATP) concentrations; these ideas are generally applicable to other molecules. Typically, one would use in vitro cells to measure ATP levels, which increases O_2 availability for respiration (thus, perturbing the parameter being measured). In such a test, cells are first disrupted using detergents, organic solvents, or physical means. The test will not measure the ATP concentration that can participate in biology; it measures the total amount of ATP in a cell because the cells were dissolved. The total concentration is believed to be about 1 to 10 mM [9–12] with much of the ATP bound to proteins, such as actin. The free or effective concentration of ATP is not the same as the total amount of ATP. A recent study suggests that the ATP concentration in rapidly growing cancer cell lines after extraction is ~1 mM [13]. Another issue in the assessment of ATP concentrations within cells is the spatial heterogeneity of ATP production [13–15]. For example, using genetically encoded constructs, Imamura et al. [14] have shown that the ATP level in the nucleus is considerably higher than in the cytosol which is higher than that within mitochondria. Thus, it is possible that previous estimates of ATP at \sim 5 mM in the nucleus [11] with lower concentrations in the cytoplasm were correct. This raises the question: "what is the origin of this nuclear ATP?" As all glycolytic enzymes can be found, at least transiently, in the nucleus [16,17], nuclear glycolysis seems possible; but it is not likely because there is no proof that nuclear glycolytic enzymes make ATP. One known source of ATP production in nuclei is the conversion of poly(ADP-ribose) to ADPribose, which, in the presence of pyrophosphate, forms ATP catalyzed by pyrophosphatase NUDIX5 [18]. NUDIX5-derived ATP can be used in chromatin remodeling [19] and, very likely, to support other functions. NUDIX5 appears to be important in cancer because enhanced expression is associated with poor prognosis whereas suppression of NUDIX5 reduces proliferation and invasiveness of carcinoma cells [19,20]. It seems likely that ATP and NUIX5 play multiple roles in cells.

To understand biochemical reactions in living cells, it is important to know the effective concentration of solutes. In the case of ATP, we obtain an estimate of the effective concentration by measuring the free concentration. The ATP molecules bound to actin are essentially in a solid phase. However, this only corrects for tightly bound ATP, and the concentration must also be corrected for other ATP interactions. This correction requires knowledge of the activity coefficient. Unfortunately, the correction for low affinity interactions is difficult. Not only is it difficult to measure biochemical activity coefficients in vitro, but the application of activity coefficients is difficult because solute molecules interact with themselves and other molecules to decrease the effective solute concentration. Although progress has been made in biomolecule activity coefficients [21], estimates for the intracellular environment have not yet been made. It might be useful to develop means of estimating the impact of these interactions on enzyme reactions in vivo (within living organisms), which could support computational modeling of biochemical reactions in vivo.

ATP is an amphipathic molecule, with both hydrophilic (triphosphate) and hydrophobic (adenosine) regions. A recent study by Patel et al. [22] provides strong evidence that ATP acts as a hydrotrope or hydrotrope-"like" material. Hydrotropes are amphipathic compounds that solubilize hydrophobic molecules in aqueous media. A concentration of ~1 mM ATP is necessary to support in vitro and in vivo hydrotrope activity. ATP at this concentration inhibits the aggregation of proteins (generally positively charged and relatively disordered) and in some cases, dissolves filamentous protein aggregates. ATP also binds to small compounds [13]. A similar molecule, guanosine triphosphate (GTP), also possesses hydrotropic activity. The high nuclear ATP concentrations may be necessary to promote the solubilization of proteins and chromatin within nuclei. Nuclear ATP appears to be uniformly distributed in cancer cells [13]. As ~100 μ M ATP is sufficient for ATPdriven enzymology, its role as a hydrotrope provides a function for higher concentrations of nuclear ATP.

2.2. Intracellular Conditions: Concentration, Solvation, and Proximity

Intracellular conditions bear little resemblance to extracellular conditions. The intracellular environment is a slightly alkaline KCl solution, while the extracellular environment is primarily a NaCl solution. Cells possess multiple redox couples to

manage intracellular chemistry [23,24]. Unfortunately, it is difficult to properly monitor all these parameters simultaneously.

The protein concentrations within cells are very high and can be near their solubility limit or in a supersaturated solution. For example, in erythrocytes, hemoglobin is found at a concentration of 330 g/L [25,26], a concentration that would form a supersaturated solution in vitro. Intracellular protein concentrations vary from 300 to 400 g/L—corresponding to nominally saturated or supersaturated conditions in vitro [27,28]. Under certain conditions, hemoglobin type S and C polymerize in vivo. In the case of hemoglobin S, the formation of polymers leads to the sickle-shaped erythrocytes of sickle cell anemia. Indeed, supersaturating conditions causing proteins to aggregate may be an important pathway in the biogenesis of diseases [27,28]. Having said that, not all agglomerations (a clump of cohesive substances) inhibit cell functions. For example, the activity of some enzymes is increased by agglomeration (see Section 4).

To begin to understand the complex intracellular environment, several approaches have been developed to provide access to the cell's interior. Methods used in these in situ, or in their original locations, experiments include cells treated with organic solvents such as toluene, electroporation, and semi-intact or permeabilized cells (e.g., streptolysin O) [29–32]. These samples are used to assess enzyme reactions under conditions similar to those of living cells in comparison to in vitro conditions. When the activities of several enzymes were tested, the K_m values were unchanged, decreased, or increased. For glycolytic enzymes, many K_m values remain unchanged or increased in magnitude; however, the K_m values of phosphofructokinase (PFK) and glyceraldehyde 3-phosphate dehydrogenase (GAPDH) were increased in permeabilized cells [30], suggesting that at this rate-controlling step of glycolysis, these enzymes have a lower affinity for substrate.

PFK will be used as an example of in vitro and in situ differences in enzyme activity. PFK is an allosteric highly regulated rate-limiting step of glycolysis [33]. PFK's activity is influenced by many factors including PFK concentration, fructose 6-phosphate (F6P) concentration, assembly state (monomer, dimer, tetramer, cluster, agglomeration), binding to other structures such as membranes and the cytoskeleton, environmental conditions (temperature, pH, and redox conditions, and allosteric factors including ATP, citrate, fructose 2,6-bisphosphate (F2,6BP), fructose 1,6-bisphosphate (F1,6BP, etc.) [29–37]. As an allosteric enzyme, PFK does not follow Michalis–Menton kinetics and therefore, K_m values do not apply. Instead, S_{0.5} values are used. The in vitro and in situ S_{0.5} values of PFK are 0.2 and 0.4 mM [29]. The S_{0.5} value for F6P is 22 μ M, which is near the intracellular concentration of F6P. Interestingly, the allosteric properties of PFK are reduced in situ and at high PFK concentrations [29–37]. It would seem the in vivo regulatory potential of allosteric modifiers may be less than thought based upon their in vitro biochemistry. The specificity constant (k_{cat}/K_m) (sometimes referred to as the enzyme efficiency) for F6P is 0.24 × 10⁸ M⁻¹s⁻¹, which is close to that of diffusion-limited reactions (10⁸–10⁹ M⁻¹s⁻¹) [37].

The rate-controlling event of diffusion-limited reactions is the arrival of the substrate at the enzyme; thus, the enzyme's reaction is faster than the transport of the substrate to the enzyme [37]. Although uncommon in biochemistry, a few examples of diffusion-limited enzymes are acetylcholine esterase, superoxide dismutase, fumarase, triosephosphate isomerase, and carbonic anhydrase. To provide optimal enzyme activity, diffusion-limited enzymes are uniformly distributed throughout cells. If these enzymes were clustered together, they would locally deplete their substrate, thus reducing the product formation rate. On the other hand, most enzymes are reaction-controlled, with specificity constants of about $10^5 \text{ M}^{-1}\text{s}^{-1}$. Although the performance of individual enzymes cannot be accelerated by orders of magnitude, enzyme agglomeration can increase a biochemical pathway's product output by orders of magnitude [38,39].

When numerous consecutive enzymes of a pathway become clustered, the properties of the pathway may differ from that of individual components [40]. A leading example of such a system is the purinosome, which synthesizes the purine precursor inosine monophosphate from phosphoribosyl pyrophosphate, ATP, formate, and other substrates. Puri-

nosomes form in tumor cells during hypoxic conditions [41]. Purinosomes are particularly useful because they assemble, disassemble, and traffic to mitochondria on an easily accessible laboratory timescale. Fluorescence microscopy studies have co-localized purinosome subunits with one another and showed that their clustering/de-clustering is regulated by the number of purines and other molecules in the culture medium [42]. Purinosomes co-localize with and translocate along microtubules at about 55 nm/sec. [43], but their motion is constrained near mitochondria [44]. The purinosome's enzymes have specificity constants of $\sim 10^5 \text{ M}^{-1} \text{s}^{-1}$ in vitro. Using mass spectrometry imaging, Pareek et al. [45] have directly shown the presence of subcellular regions low in substrates and high in synthetic intermediates produced by purinosome when cells are grown in the absence of exogenous purines. These hotspots of substrate depletion are spatially coincident with purinosomes in cells [45], thus suggesting that diffusion is a limiting factor in this pathway. This seems surprising because their specificity constant is in the order of $10^5 \text{ M}^{-1}\text{s}^{-1}$. Thus, the purified enzymes in vitro behave like reaction limited enzymes, but the in vivo pathway displays characteristics of a diffusion limited activity. There is no paradox because the specificity constant is measured using purified monodisperse enzymes in vitro. Purinosomes only assemble within cells and have not been reconstituted in vitro; these structures are large enough to contain dozens or hundreds of copies of each enzyme within this pathway. Clustering enhances the reaction rate by almost an order of magnitude—thus, the catalytic performance of the pathway is influenced by the supramolecular structure of its component enzymes [46]. Purinosome catalytic activity may also be influenced by their ability to move along microtubules to enhance their proximity with mitochondria, which are also associated with microtubules. This is anticipated to increase the availability of mitochondrial metabolites, including formate, for synthetic reactions of purinosomes [46]. Proximity relationships are important in purine synthesis at multiple levels.

2.3. Phase Separations in Two and Three Dimensions

Compartmentalization of intracellular chemical reactions is a crucial strategy of cells. Cells often separate distinct functions into separate membrane-bound organelles [47]. This is a good strategy to separate oxidative and reductive chemistry as well as anabolic and catabolic biological pathways into different intracellular containers to prevent intracellular chemistry from operating at cross-purposes. For example, proteins are synthesized in the endoplasmic reticulum and cytoplasm, but digested within lysosomes. ATP is primarily synthesized by mitochondria using potential energy stored in the form of a proton gradient. This standard model of cell biology has been revised in the past few years by the introduction of the role of phase separations into cellular health and disease. The intracellular phase changes take place in two-dimensional cell membranes and in three-dimensional liquid–liquid phase separations (LLPS) of cell structures such as nucleoli.

There is a rich literature concerning lipid phase separations in model lipid membranes [48–51]. Lipid–lipid interactions, and consequent line tension at the perimeter of phase separations, contribute to these structures, which vary greatly in size. Specializations or "domains" in cell membranes take many forms, including lateral phase separations. Cell membrane domains are created in many ways including protein-to-protein interactions, attachment of an external agent, linkage to the cytoskeleton, and membrane curvature. Proving the existence of cell membrane domains in general, and lipid phase separations specifically, is very challenging. The emerging consensus is that cell plasma membranes and intracellular vacuole membranes can exhibit lipid phase separations, some of which are quite compelling. Plasma membrane phase separations are typically ~20 nm in size whereas vacuolar membrane phase separations are ~200 nm in size. Membrane phase separations may form liquid-ordered and liquid-disordered phases. Membrane lipid phase separations have been observed in bacteria, amoeba, and higher eukaryotes [52–59]. Evidence for the existence of lipid phase separations in vacuole membranes comes from fluorescence microscopy and freeze fracture electron microscopy [60]. The study of lipid phase separations in plasma membranes is difficult because the phase separations are small, their existence

is transitory, and plasma membranes are quite heterogeneous. Using B cell receptors as a model system, lateral phase separations have been demonstrated using Förster resonance energy transfer (FRET) [57] and super-resolution fluorescence microscopy coupled with cross-correlation data analysis [59]. Specifically, it was found that the B cell receptor traffics to liquid ordered regions of plasma membranes, which constitute a small percentage of the total surface area. These lateral phase separations are important because they recruit Lyn kinase to the lipid ordered region and exclude phosphatases, such as CD45, both of which heighten signaling. Thus, the lipid phase separation influences the physiological behavior of the signaling apparatus [57–59].

In three dimensions, LLPS form membrane-free organelle-like structures, which are also known as biological condensates. Nucleoli are a type of LLPS observed in eukaryotic cells. In some cases, LLPS may be specific for a certain cell type. A few of the types of LLPS found within cells include nucleoli, microtubule organizing centers/centrosomes, stress granules, Cajal bodies, P bodies, and others [60–62]. The formation of three-dimensional LLPS can be promoted by highly repetitive regions. Several types of physical interactions such as protein–protein, RNA–protein interactions, RNA–RNA interactions, poly-ADP-ribosylation, hydrophobic, electrostatic, π – π orbital interactions, and multivalent cation– π interactions but can be dissolved by dilution. These unique phases are known to sequester/desequester certain biomolecules, such as PFK [65]. They also provide an environment where molecular motion is reduced and protein concentrations are high, which are believed to facilitate certain chemical reactions.

Nucleoli participate in ribosome production including rDNA synthesis, maturation of rRNA, assembly of ribosome subunits, and transport to the cytoplasm. As new ribosomes are essential in producing proteins to support cell division, the nucleolus is essential in cell proliferation. Having said that, most proteins in nucleoli are not related to ribosome synthesis, which suggests additional functions for nucleoli. In cancer, the nucleolar size increases dramatically, which is due, at least in part, to the burden of ribosome production. Indeed, large nucleoli (and/or an increase in the number of nucleoli) indicate the presence of tumor cells, but this does not prove that the cells are aggressive and will become invasive or metastatic. Another important function of nucleoli is to repair DNA, which will be discussed in Section 4.

LLPS have several distinct catalytic advantages, which have been tested in vitro [66]. DEAD (asp-glu-ala-asp) box proteins contain the DEAD amino acid sequence and can be found in nuclei where they function as RNA helicases by unwinding short RNA duplexes. The nucleolar DEAD-box protein Ddx4 spontaneously forms LLPS droplets in vitro and in living cells [67]. A feature of these LLPS is that their dielectric constant is ~45, which is about the same as the solvent DMSO (dimethylsulfoxide); this alone could have substantial effects on chemical reaction rates [68]. Short double strand DNA is spontaneously accumulated and then separated within these droplets, with no supply of energy. LLPS can also be created using chimeric proteins composed of the low complexity region of the DEAD-box proteins and the enzyme adenylate kinase [69]. These molecules spontaneously form LLPS with relative protein concentrations increased ~50–150-fold and a 5-fold increase in catalytic activity at a dielectric constant of ~32. Thus, it is possible to create mini-reactors to construct molecules in vitro or in vivo.

2.4. Redox Conditions

The intracellular redox status is important in normal cell functions (such as signaling, transcriptional regulation, and post-transcriptional changes), cell damage by oxidative or reductive stress, cell growth and proliferation, and enzyme kinetics [23,24]. Intracellular redox conditions are often assessed using the glutathione couple GSSG/GSH, NAD⁺/NADH, and/or NADP⁺/NADPH. Other biologically relevant redox couples include flavin adenine dinucleotide (FAD)/FADH₂, flavin mononucleotide (FMN)/FMNH₂, and thioredoxin re-

ductase (Trx(SH₂)/TrxSS) [23]. Experiments typically measure the ratio of oxidized and reduced glutathione and the total glutathione concentration.

Cells may be damaged by oxidative conditions, as outlined in the next section. Superoxide anions, per se, are not a significant factor in oxidative cell damage, as they react with Fe-S centers of certain proteins such as succinate dehydrogenase and NADH-ubiquinone oxidoreductase [45] but rather make a better reducing agent [7]. However, downstream products of superoxide anions such as those of the Haber-Weiss reaction, lead to the production of hydroxyl radicals. Hydroxyl radicals initiate the lipid peroxidation pathway and its products (e.g., 4-hydroxy-2-nonenal; Figure 1) to cause extensive cell damage. The protonated form of superoxide anions, hydroperoxide radicals (HOO•), is reactive, and could contribute to intramembrane reactions.



Figure 1. Structures of 4-hydroxy 2-nonenal (4-HNE) and its reaction products with lysine (Lys) residues of proteins. 4-HNE reacts with Lys via Schiff base formation and Michael addition. Both products may rearrange to stabilize the linkage.

The importance of understanding redox conditions in complicated cellular environments is underscored by human studies. One might think that antioxidants would be useful in protecting against the potential damage of oxidizing agents in vivo (as illustrated in Section 3). Adding antioxidants will reduce the oxidative burden on cells. However, in a clinical trial assessing antioxidant use by smokers (who may have pre-invasive lung cancer lesions), the cancer risk of patients is significantly increased due to antioxidant intake [70]. A decrease in oxidative burden is thought to allow an increase in the level of intracellular reducing agents. This may perturb intracellular signaling, such as the redox-sensitive RhoA (GDP \rightarrow GTP) reaction, to cause indolent cancer lesions to become aggressive. The clinical trial was terminated early, but it does teach that manipulating redox levels must be carefully performed.

The redox potentials of chemotherapeutic agents are another important area to consider. Aggressive cancer cells display the Warburg Effect, which is also known as aerobic glycolysis [36]. During aerobic glycolysis, the activity of the glycolytic pathway is greatly increased while mitochondrial activity only accounts for ~50% of ATP production. The increased production of NADH unbalances the NAD⁺/NADH redox couple. Low levels of NAD⁺ cause reductive stress and could lead to tumor cell death. Although oxidative anti-cancer drugs are widely used, they may provide a mechanism for the most aggressive tumor cells to avoid reductive stress, and therefore hasten cancer recurrences. This might happen because certain anti-cancer oxidative drugs accept electrons from NADPH and glutathione [71]. Therefore, we have proposed that oxidative therapy should be coupled with subsequent reductive tumor therapy to address the potential ability of oxidative agents to protect a subset of dangerous recurrent tumor cells, especially in cancer patients suffering metastatic disease [72].

3. Carcinogenicity

Nucleosomes participate in packaging long DNA molecules within living cells. DNA has a high negative charge and is stored by wrapping it around positively charged histones. These structures are quite stable [73]. However, these primary interactions between histones and DNA only neutralize about 50% of DNA's negative charges. To undergo the next level of compaction, the remaining negative charges must be neutralized. Other agents such as linker histones, positive counterions, etc., are responsible for neutralizing these remaining charges, which are required to further condense DNA [73]. Tumor cells can be recognized by their large nucleoli [74], which suggest a reduction in DNA compaction. Altered histone management in cancer is suggested by the fact that nucleosomes are observed in the circulatory systems of patients [75].

Carcinogenesis is about how cancers come to be. Genetic contributions to cancer may be inherited or acquired during one's lifetime. Chemical processes, especially oxidation, are believed to participate in carcinogenesis. The oxidation of cellular lipids leads to breakdown products such as 4-hydroxynonenal (4-HNE) and 4-oxononenal (4-ONE). To better understand these events, we examined tissue samples from patients diagnosed with the pre-invasive disease ductal carcinoma in situ (DCIS) of the breast. 4-HNE, a product of the lipid peroxidation pathway, is genotoxic and causes DNA fragmentation and mutations. It is a reactive amphipathic breakdown product of ω -6 fatty acids in cell membranes, where it can locally accumulate to high levels. 4-HNE forms stable adducts with proteins, which occur via Schiff base formation or Michael addition [76,77] (Figure 1).

Untreated tissue samples were observed using conventional fluorescence microscopy to find the chemical adducts formed by deleterious oxidative reactions (Schanen and Petty, 2023, unpublished). Human tissue sections were labeled with antibodies that recognize the histone H2A.X and 4-HNE adducts. In addition to being a marker for the cell nucleus, H2A.X was chosen because this molecule is associated with DNA repair. Figure 2 shows that the nucleus, as defined by the presence of the H2A.X, is a primary target of 4-HNE. This is true for patients who will and will not experience a subsequent recurrence. The preferential labeling of the nucleus suggests that the spatial distribution of 4-HNE adducts may be due to additional factors determining the location of adduct formation.

Several reasons may account for the rather selective labeling of the nucleus with anti-4-HNE adduct antibodies (Figure 2C,D). 4-HNE (and related molecules) are generated from ω -6 fatty acids in cell membrane lipids, which are then increased in number by the lipid peroxidation pathway. 4-HNE resides largely in membranes with the carbonyl group near the lipid headgroups [78]. Due to the limited solubility of 4-HNE in the aqueous cytosol and the presence of aldehyde dehydrogenase and aldose reductase in the cytoplasm, the cytoplasm is minimally labeled with 4-HNE adducts. 4-HNE is much more soluble in nuclei. The high concentrations of ATP in nuclei [9-13] may act as a hydrotrope [22] to solubilize 4-HNE; ATP has been previously shown to interact with small molecules [14]. The high nuclear concentration of ATP may stabilize proteins [79] and nucleic acids. Moreover, the dielectric constant of nucleoli-like LLPS is 45, about the same as DMSO in which 4-HNE is highly soluble (50 mg/mL). The biological effect of these reactions is illustrated in Figure 3. Under normal circumstances, the negatively charged DNA polymers bind to histones (Figure 3C,E). However, in the case of 4-one damage, 4-one and other molecules such as 4-HNE react with histones [80], decreasing the positive charges expressed on the histone. This is expected to have many effects on targets including [81] sterically hindering the binding of epigenetic markers and DNA packing (Figure 3D,F). As the DNA is no longer well-sequestered by histones, it becomes more accessible to chemical and environmental damage. If the damage is serious, a tumor may become aggressive. If these changes, through a complicated and poorly understood set of reactions, ignite the rapid uptake and metabolism of glucose, the cells are destined to become aggressive, and the patients may recur after surgery.



Figure 2. Representative fluorescence micrographs of histone H2A.X (**A**,**B**) and 4-HNE-labeled human DCIS tissue sections. Samples from patients who did not experience a cancer recurrence (**A**,**C**) and who did experience a cancer recurrence (**B**,**D**) are shown. For each patient, (**A**,**C**) and (**B**,**D**), both biomarkers were found in the nuclei of ductal epithelial cells. This indicates that 4-HNE and H2A.X are present in the nuclei of both recurrent and non-recurrent DCIS tissues. Thus, co-incident labeling of both histones and 4-HNE could be an early step in the formation of indolent and aggressive DCIS lesions. (Bar = $200 \mu m$).



Figure 3. Potential contributions of 4-HNE to histone and DNA damage. This figure focuses upon 4-HNE damage to histones, although 4-HNE also directly reacts with DNA. Panels (**A**,**B**) illustrate an undamaged cell and a cell damaged by exposure to 4-HNE, respectively. Both undamaged and damaged cells have enzymes (aldehyde dehydrogenase, ALDH2, and aldose reductases) that limit the cytoplasmic damage due to aldehydes. In damaged cells, 4-HNE is present, primarily in lipid membranes. However, 4-HNE is much more soluble in nucleoli because high concentrations of ATP in nuclei act as a hydrotrope to solubilize 4-HNE, and the dielectric constant of nucleoli is 45, about the same as DMSO in which 4-HNE is highly soluble (50 mg/mL). In undamaged cells, positively charged amino acids electrostatically interact with DNA, as illustrated by panel (**C**). However, in damaged cells, the positive charged histone binding sites are blocked due to the formation of stable 4-HNE adducts (panel (**D**)). In undamaged cells, DNA wraps around histones (**E**). DNA storage is less effective in damaged cells, leading to DNA strands that are much more susceptible to further damage, including that of additional 4-HNE molecules (**F**).

4. Chemical Engineering Meets Cancer Biology: Enzyme Agglomeration in Cancer Recurrences

Enzyme aggregates or clusters are often encountered in cellular biochemistry, and studies of monodisperse enzymes in dilute solution may be irrelevant to human disease. The aggregates range from dimers to agglomerations of many thousands of enzymes. For example, PFK may be expressed as a dimer, but only becomes fully functional as a tetramer due to allosteric interactions among the subunits [82]. It can form higher order structures in homologous or heterologous fashions.

Metabolons are multienzyme complexes wherein the product of one enzyme in a pathway is a substrate of another nearby enzyme within the metabolon. The metabolons may be membrane-associated (e.g., glycolytic metabolons) or not (e.g., purinosomes). Additional examples of metabolons are the respiratory protein complexes (e.g., NADH dehydrogenase) and Kreb's TCA (tricarboxylic acid cycle) enzymes of mitochondria [83,84]. In some cases, metabolons are membrane associated, and in others they are not.

Glycolytic enzymes may be attached to the inner side of plasma membranes. For example, in human erythrocytes, the integral membrane protein band 3, an ion transporter, binds to GAPDH, aldolase, pyruvate kinase (PK), PFK, and lactate dehydrogenase (LDH) via specific glycolytic enzyme binding sequences Asp⁶-Asp-Tyr-Glu-Asp¹⁰ and Glu¹⁹-Glu-Tyr-Glu-Asp²³ [85]. Not surprisingly, phosphorylation of Tyr⁸ or Tyr²¹ blocks the binding of glycolytic enzymes to band 3, which is associated with deoxygenated erythrocytes. Moreover, other peripheral membrane proteins and cytoskeletal proteins display glycolytic enzyme binding sequences and bind to glycolytic enzymes. In erythrocytes, these glycolytic enzymes also bind to spectrin, ankyrin, actin, p55, and protein 4.2 [85]. In yeast, actin microfilaments stabilize glycolytic metabolons [86]. In other cell types, another cytoskeletal component, microtubules, and monomeric tubulin bind to GAPDH, aldolase, PK, and LDH with a K_D of ~1–5 $\mu M.$ In addition, PFK, phosphoglucose isomerase, and phosphoglycerate kinase bind to microtubules. Moreover, caveolin-1, a cytoskeletal structure that mediates the formation of caveolea, possesses a binding site for PFK and aldolase. Total glycolytic enzyme binding is increased in breast cancer cells due to the overexpression of caveolin-1 [87]. Returning specifically to the erythrocyte, layers of glycolytic enzymes are formed at the inner surface of the plasma membrane (composed of glycolytic enzyme-binding components) and the adjacent cytoskeletal layers (spectrin, actin, ankyrin)---thus creating a thin container lined with catalytic enzymes. This region can retain ATP at concentrations higher than that of the bulk cytoplasm, thus forming a membrane proximal compartment to power membrane transport systems of the erythrocyte [88].

As the metabolism undergoes dramatic changes to support the proliferation and aggressive behavior of tumor cells, we sought to better understand the regulatory steps of metabolism in cancer. Computational analysis of glycolysis has shown that its key rate-limiting steps are glucose transport, hexokinase action, PFK catalysis, and lactic acid export from cells [89]. Glucose uptake via phospho-Ser-226-GLUT1 and PFK1 (PFKL) steps were found to be of especial interest in retrospective case-control clinical trials, as they serve as a prognostic test for cancer recurrences [90–93]. In recurrent cancer cells, these two biomarkers underwent trafficking to the plasma membrane (and elsewhere), presumably to enhance glucose uptake. However, the normally expressed forms in nonrecurrent cancer, glucose transporter type 1 (GLUT1), and phosphofructokinase type P (PFKP) could be found in tumor cells of samples from women who did and did not subsequently develop a recurrent cancer. As protein phosphorylation and enzyme isoform switching alter metabolic pathway performance in normal and cancer cells [94,95], we focused on phospho-Ser-GLUT1 and PFKL isoforms that greatly enhanced performance (Table 1). The V_{max} of GLUT1 is increased 5-fold by phosphorylation of the serine residue at position 226 [96]. When phospho-Ser226-GLUT1 was localized in DCIS samples of women who did not subsequently experience a recurrence, this biomarker was found at or near the nucleus (Figure 4A). In contrast, when tissue samples from patients who experienced a recurrence were studied, phospho-Ser226-GLUT1 was found in the vicinity of the plasma

membrane (Figure 4B). This contrasts with the non-phosphorylated form of GLUT1, which did not undergo any remarkable changes when recurrent and non-recurrent forms of DCIS were compared. It seems likely that phospho-Ser226-GLUT1 moved from the cell center to the cell periphery to promote the uptake of external glucose in cells from recurrent patients.

Non-recurrent Recurrent phospho-Ser226-GLU PFK

Figure 4. Spatial properties of glycolytic components in human DCIS lesions. Immunofluorescence micrographs of DCIS samples from women who did not exhibit cancer recurrences (**A**,**C**) and women who did report a cancer recurrence (**B**,**D**). Sections of tissue were labeled with antibodies directed against phospho-Ser226-GLUT1 (**A**,**B**) and anti-PFKL (**C**,**D**). Samples were labeled with secondary antibodies to visualize these spatial patterns. For patients who did not experience a recurrence, phospho-Ser226-GLUT1 and PFKL were found near the cell center, which appears to be the region of the nucleus and nucleolus. These spatial patterns of glycolytic elements changed for women who reported a recurrence. For these women, phospho-Ser226-GLUT1 and PFKL could be found near the cell periphery (**B**,**D**). Presumably, the phospho-Ser226-GLUT1 and PFKL accumulated at the periphery to mediate the internalization and metabolism of glucose, respectively. Many micrographs like these were used to train computers to recognize recurrent and non-recurrent lesions. These results underscore that the location, not simply the amount of biomarker, is important in assessing the recurrent or non-recurrent status of a patient. (Bar = 200 µm).

PFKP (PFK, platelet type) and PFKM (PFK, muscle type) are feedback inhibited by the PFK type 1 product F1,6BP. On the other hand, PFKL is feedback activated by F1,6BP, which auto-activates enzyme performance. When samples from women who did not have a subsequent cancer recurrence were tested using anti-PFKL antibodies, PFKL was found in the nucleoli of tumor cells (Figure 4C), where it co-localizes with histone H2A.X [91]. On the other hand, when samples from recurrent women were tested, PFKL was generally found at the periphery of ductal epithelial cells (Figure 4D). In contrast, PFKP and PFKM displayed no remarkable changes in cellular localization when non-recurrent and recurrent cells were compared [91]. Importantly, the disappearance of PFKL from nucleoli parallels a nucleolar phase change that has been observed and reconstituted [65], which suggests that the nucleolar phase change is one factor accompanying the activation of aerobic glycolysis in aggressive cancer. Thus, during cancer recurrences, tumor cells mobilize the higher performing transporter phospho-Ser226-GLUT1 and the enzyme PFKL to the plasma membrane where phospho-Ser226-GLUT1 increases net glucose flux while PFKL can be accelerated to high levels to remove its substrate from the cytoplasm to maintain a large glucose gradient (and flux) in tumor cells.

Immunofluorescence micrographs of the two proteins described above, phospho-Ser226-GLUT1 and PFKL (Figure 4), are sufficient to accurately predict the outcomes (recurrences or non-recurrences) of DCIS patients [92,93]. To establish prognoses at a high level of accuracy, we employed computer vision. Pathologists and computer vision programs do the same thing: they evaluate tissue patterns to draw inferences about the underlying tissue chemistry. Pathologists observe several variables in micrographs, such as color and size, whereas computer vision analyzes many millions of variables to find several dozens of mathematical variables that predict recurrences and non-recurrences. Over the past few decades, pathologists have been asked to do more, including predicting disease outcomes, and this is now possible using machine tools to assist pathologists [93].

In addition to phospho-Ser226-GLUT1 and PFKL, the perimembrane region of ductal epithelial cells of women who will experience a cancer recurrence are known as metabolic platforms because they also contain: 6-phosphofructo-2-kinase/fructose-2,6-biphosphatase 4 (PFKFB4), glutamate cysteine ligase catalytic domain (GCLC), glutathione synthetase (GS), pentose phosphate pathway (PPP) components including glucose 6-phosphate dehydrogenase (G6PD), transketolase (TKT), and transketolase-like protein 1 (TKTLP1), RhoA and RhoA with bound GTP, and other enzymes [90]. The presence of these many enzymes, additional signaling proteins, and especially the cytoskeletal components (microtubules, microfilaments, caveolea), contribute to forming metabolic platforms. Moreover, since glycolytic enzymes can interact with other glycolytic enzymes in a homologous or heterologous fashion, such interactions may stabilize these structures. Metabolic platforms may have a large effect on associated biochemical pathways by forming a unique metabolic compartment at the cell surface where substrates enter cells. The kinetic benefit of metabolons and other enzyme oligomers is that they can form a pathway or channel between consecutive steps of a chemical pathway. Each metabolic platform has very many copies of each of many enzymes, thus forming a large organelle-like structure about the periphery of cells. The unique supramolecular structure of metabolic platforms is analogous to metabolons, but at a much larger scale. As mentioned above, large peripheral membrane structures have been described for erythrocytes [88]. In metabolic platforms, the concentration of enzyme active sites is very high while the solvent content is very low, making reactions more likely. Thus, solutes percolate through the voids and channels within metabolic platforms. As noted by Castellani et al. [39], such clusters can accelerate a two-step reaction by 8-fold and a three-step reaction by 110-fold. A potential limitation of this strategy is that substrate depletion zones may form near the structure. Two strategies to counteract this are: putting the enzymes at the periphery of the cell where their peripheral location will give metabolic platforms direct access to incoming substrates, allowing recurrent tumor cells to survive under harsh conditions, and to direct cell metabolism to serve the needs to the recurrent tumor cells.

Recently, enzyme agglomeration has been deployed in chemical engineering to produce products more efficiently in larger amounts [97–104]; the primary advantages are a relative abundance of active sites to substrates and the channeling effects. Microdroplets can be genetically engineered using chimeric enzymes containing enzyme activities of interest and DEAD domains to create nucleoli-like regions to produce products [66]. In this case, the solvent's dielectric constant and local concentrations (i.e., solute solubility) are key features.

A glance at Figure 4 reveals that glycolytic elements change position in samples from women who subsequently experience a cancer recurrence. This happens because the machinery described above is needed near the plasma membrane to manage the high flux of glucose necessary to support aerobic glycolysis. Therefore, mathematic relationships of biomarkers within human tissues were extracted from patient micrographs using training datasets containing micrographs from recurrent and non-recurrent patients. Training datasets were immunofluorescence micrographs of patient samples stained with antiphospho-Ser226-GLUT1 and PFKL. Therefore, one could perform binary classifications of patients with unknown outcomes [38,72,90–93]. For example, the computer was trained with images such as those of Figure 4. In the images of phospho-Ser-GLUT1, the computer was trained on the peripheral distribution of this antigen in epithelial cells. Other locations of this antigen were also learned by the computer including blood vessels, cancer-associated fibroblasts, myoepithelial cells in combination with appropriate weighting factors to arrive at a predicted outcome. In this way, a patient's outcome could be predicted many years in advance at high accuracy for patients held out of the training dataset [93]. The software identified recurrent cases with no false negatives, non-recurrent women, and false positives due to the efficacy of mastectomies [93]. As blood vessels of African American women have elasticities differing from other races [93], it is very important to balance the training datasets properly and to perform tests on a large holdout dataset including many African American women. As these computer findings underscore, the entire tissue, not just tumor cells, participates in cancer recurrence predictions—and presumably, physiological recurrences. Importantly, 20% of micrographic fields (an average among patients) could lead to a recurrent cancer. This supports the idea that tumors are heterogeneous, possessing both cells that could and could not lead to a recurrence [93]. The machine analysis of DCIS patients will permit improved DCIS patient management. This approach could also be used as a companion diagnostic to choose therapeutic antibodies by inspecting the binding of various therapeutic antibodies to a specific recurrent DCIS patient's tissue, which may permit the elimination of disease at the in situ stage.

5. Discussion

We began this review with a call for the increased application of physical chemistry in cancer biology. To avoid writing in silos, fundamental chemical principles and cancerrelated biology were reviewed simultaneously. The point is to integrate, insofar as possible, the theoretical and experimental rigor of physical chemistry with breast cancer studies.

To illustrate the importance of applying physical chemistry to cancer biology, we present two fundamental problems in cancer biology: carcinogenesis and cancer recurrences. Consider breast tissue at a steady state in homeostasis within its organismal environment. Every cell is exposed to many millions of potentially harmful oxidative reactions every day. If the repair efficacy is 99.9%, re a vast number of damaged DNA molecules exist. If an oxidative reaction damages junk DNA, which accounts for a considerable portion of human DNA, no problem emerges because this DNA encodes nothing. We surmise that junk DNA has a function—to function as a decoy target. If a mutation occurs in an unimportant region of a gene product, no change in outcome will be observed. However, if a key part of a sensitive protein, such as a tumor suppressor gene, is damaged, that change will make a substantial difference in patient outcome. In Figure 3, we illustrate one key site of damage, histones. 4-HNE and similar aldehydes are generated by the attack of radicals on ω -6 fatty acids in cell membranes. However, 4-HNE is poorly soluble in the

aqueous cytosol. Any 4-HNE molecules in the cytoplasm can be destroyed by aldehyde dehydrogenase or by aldose reductase activity (Figure 3). 4-HNE molecules that find their way to the nuclear envelope will spontaneously partition into nucleoli due to their dielectric constant (~45). High ATP concentrations may also contribute to solubilizing 4-HNE in aqueous regions of the nucleoplasm. Reactions of 4-HNE with histones alter the surface charge of histones by blocking positive charges at their surfaces, thus reducing electrostatic interactions with DNA. This modification also sterically hinders the association of DNA with histones. Consequently, DNA is no longer safely ensconced at nucleosomes. The unwound DNA makes a better target for damage. If a tumor suppressor gene is mutated to a non-functional state, tumor aggression may not be restrained.

Tumor cells are recognized by changes in their nuclear staining with H&E dyes. The enlarged nuclei appear to correlate with changes in DNA compaction, ribosome production, nucleosomes in the peripheral blood of patients, PFKL trafficking in a subset of recurrent cells, and as this region enlarges, there will likely be changes in chemical reactivities, nucleolar LLPS, and local dielectric constants. These ideas are consistent with recent interest in the role of nucleoli in cancer [105–107]. Changes in nucleolar phase likely contribute to PFKL release and to DNA de-compaction and consequent mutations. These changes may also desequester additional enzymes to re-wire cell metabolism, thus promoting recurrences.

The re-wiring of the cell metabolism increases glucose uptake by tumor cells. As described above, phospho-Ser226-GLUT1 departs from the nuclear area to accumulate at the cell periphery, while PFKL is desequestered from nucleoli before trafficking to the region of the plasma membrane. Both steps accelerate glucose transport by moving glucose or accelerating its metabolism to maintain the glucose gradient. Other rate-limiting steps of glycolysis, including hexokinase II and the monocarboxylate transporter type 4, undergo changes in number and/or location to maintain glucose internalization and lactic acid removal. The collection of the glycolytic, hexose monophosphate shunt, and glutathione synthesis machinery at the plasma membrane form metabolic platforms (Figure 5). Due to enhanced catalytic ability of such agglomerations, metabolic platforms likely contribute to metabolic alterations in aggressive cancer cells. From a basic science standpoint, these steps account for the biochemical mechanism of the Warburg Effect. From a clinical standpoint, computer vision analysis of phospho-Ser226-GLUT1 and PFKL are sufficient to diagnose a DCIS patient that has a lesion capable of recurring and requires clinical intervention.

As the scientific community has characterized most of the high-affinity interactions, perhaps it is time to move on to the lower-affinity interactions. Chemists may avoid weak interactions because they are more difficult to measure. Biologists, with broad brushstrokes, do weak interactions the indignity of calling them non-specific, and discarding their potential relevance. However, are weak interactions important? Of course, they are. Although van der Waals forces are weak, they collectively participate in membrane-membrane adhesion, protein stabilization, and the hydrophobic effect, among others. Moreover, as intracellular proteins are near or above their reported solubility, small changes in conditions can have a large effect on solubility. A single point mutation in hemoglobin creates polymer-like structures in erythrocytes of patients with sickle cell anemia. As intracellular proteins are near the cusp of their solubility, small changes in conditions cause protein agglomerations leading to neuromuscular disease [27,108]. LLPS also effect neurodegeneration [108]. Certain proteins spontaneously come out of solution—no ligand-to-receptor interactions are required. In the case of metabolic platforms, several mechanisms including diffusion and active transport on the cytoskeleton can explain their accumulation at the plasma membrane. Although the factors stabilizing metabolic platforms are unknown, the saturated to super-saturated cytosolic protein concentration, the overexpression of glycolytic enzymes in cancer, and the affinity of these enzymes for one another may contribute to metabolic platform stabilization.



Figure 5. An illustration of peripheral enzyme agglomerations or metabolic platforms in recurrent breast cancer cells. On the left side is shown a biological plasma membrane in black and white. Mechanisms of membrane association are illustrated along the left-hand side including, from top to bottom: prenylation, membrane metabolons, and caveolae, including caveolin-1-associated enzymes. To the center-right is shown a component of the cytoskeleton, such as a microtubule with bound PFKL. A broad variety of enzymes are illustrated in this figure by the broad variety of colors. This corresponds to the metabolic platforms shown in Figure 4D. This includes enzymes of glycolysis, the hexose monophosphate shunt, and the glutathione biosynthesis pathway in various colors. For clarity, this figure underestimates the intracellular crowding of the cytoplasm.

We have previously discussed several drugs that interact with elements of the mechanistic steps of cancer recurrence mentioned above, and therefore, they might contribute to the effects of the drugs [92]. These include:

- Taxol—dissociates PFK from the plasma membrane [109],
- Colchicine and other alkaloids—disrupt intracellular trafficking by inhibiting microtubule functions [110],
- Local anesthetics—disrupt microfilaments, and thereby destabilize metabolons [111–113],

- Prenylation inhibitors—disrupt membrane association of certain signaling proteins [114,115],
- KU55933—blocks GLUT1 translocation to the plasma membrane [116],

This suggests that the pathway described above may be a useful drug target.

Although many drugs act via high affinity lock-and-key interactions, some drugs of unknown mechanism may act by influencing weaker interactions. For example, weak interactions ($K_d \sim 10^{-5}$ to 10^{-3} M) combined with network analysis have proven to be a useful approach in conventional drug design [117]. Metabolons and metabolic platforms seem to be excellent candidates for this approach, as there are multiple sites on multiple different proteins contributing to these structures. The Asp-Asp-Tyr-Glu-Asp sequence is an example of relevant blocking peptide. As agglomeration is expected to greatly increase pathway performance, these targets may show clinical efficacy (see bullet points above). Interfering with these interactions may influence pathway performance, as mentioned above. In another form of cancer therapy, hyperthermia, tissue temperature is raised to as high as 113° F. As low affinity biochemical interactions exhibit $\Delta G^0 = \sim -5$ kcal/mol, hyperthermia could contribute to reducing low-affinity protein–protein interactions. These low-affinity interactions may include the reduction in the stability of metabolic platforms.

We suggest additional lines of future research. One important strategy is to stabilize the nucleoli. If nucleoli could be stabilized, it might be possible to maintain their internal dielectric constant and reactivity profile and block desequestration of metabolic enzymes that precede the Warburg Effect. Although additional physical parameters of tumor cell nuclei are needed to understand the stabilization, there is already some movement in terms of developing lead compounds in nucleolar stabilization. In this way, it may be possible to enhance PFK detention within nucleoli. The BRAT (TRIM-NHL protein Brain tumor) tumor suppressor gene that is known as tripartite motif-containing protein 3 (TRIM3) in humans [118] enhances longevity by reducing fibrillarin production, thereby promoting compaction [119]. As PFK nucleolar detention should be augmented by stabilizing nucleoli, enhancing the brat tumor suppressor pathway may be a route to increase PFKL detention and thereby block the Warburg Effect.

There are no computational simulations that correctly model the metabolic changes occurring during the formation of recurrent cancer, which is not surprising because the parameterization is so poor. For example, the enzyme isoforms and therefore, their kinetic rate constants, equilibrium constants, sizes, homophilic and heterophilic interactions, etc., are all wrong or missing. These errors are compounded by the fact that glycolysis, glutathione synthesis, and NADPH formation are largely taking place near the cell periphery (especially in breast cancer metastases). Another problem is that we do not know the effective concentrations of metabolites because we do not know their activity coefficients. Other parameters, such as allosteric abilities, must be adjusted to match their in situ or in vivo conditions. Such data will likely contribute to a robust computational model that replicates the in vivo behavior of aggressive tumor cell metabolism, which is likely to teach us new aspects of aerobic glycolysis. Such a computational model would allow us to simulate the behavior of one or more drugs on system properties, which could reveal new drugs to specifically interfere with breast cancer recurrences.

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