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## Glutamine Sensitivity Analysis Identifies the xCT Antiporter as a Common Triple Negative Breast Tumor Therapeutic Target

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### SUMMARY

A handful of tumor-derived cell lines form the mainstay of cancer therapeutic development, yielding drugs with impact typically measured as months to disease progression. To develop more effective breast cancer therapeutics and more readily understand their clinical impact, we constructed a functional metabolic portrait of 46 independently-derived breast cell lines. Our analysis of glutamine uptake and dependence identified a subset of triple negative samples that are glutamine auxotrophs. Ambient glutamine indirectly supports environmental cystine acquisition via the xCT antiporter, which is expressed on 1/3 of triple negative tumors *in vivo*. xCT inhibition

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#### SUPPLEMENTAL INFORMATION

Supplemental information includes 7 Figures, 7 Tables, Supplemental Experimental Procedures, and References.

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with the clinically approved anti-inflammatory Sulfasalazine decreases tumor growth revealing a therapeutic target in breast tumors of poorest prognosis, and a lead compound for rapid, effective drug development.

## INTRODUCTION

Current cancer therapeutic development methodologies are expensive, slow, and unable to predict early on, the palette and prevalence of responses tumors can mount when challenged with a prototypic drug. Breast cancer is a challenging example. Large heterogeneity exists within and between well-established subtypes and drug responses (reviewed in Weigelt and Reis-Filho, 2009). Three distinct nomenclatures group breast tumors based on: morphological criteria (*e.g.* ductal, lobular, invasive, *in situ*); expression of the estrogen receptor (ER), progesterone receptor (PR), and Her2 receptor tyrosine kinase (Her2); or molecular phenotype, derived from comprehensive mRNA similarities (*e.g.* luminal, basal). About 1/4 of breast tumors are "triple negative" (ER<sup>-</sup> / PR<sup>-</sup> / Her2<sup>-</sup>; TNBC), and usually basal molecular phenotype. They are aggressive, with poorest prognosis, high mitotic index, and intrinsic DNA damage repair defects (reviewed in Weigelt and Reis-Filho, 2009; Alli et al., 2009). A subset termed claudin low, and related metaplastic tumors have rapid disease courses, stem cell features, and chemotherapy-resistant characteristics (Hennessy et al., 2009; Prat et al., 2010). No TNBC-targeted therapeutic exists, and patient prognosis is grim.

Many tumors increase uptake and reliance on environmental nutrients such as glucose, glutamine (reviewed in Souba, W. W., 1993; Gatenby and Gillies, 2004; DeBerardinis, et al., 2008), cystine, and asparagine (Iglehart, et al., 1977; Asselin, et al., 1989). Seminal work in tumor series of increasing proliferation rate and de-differentiation (Erlich ascites, Knox et al., 1970; Morris hepatoma, Linder-Horowitz et al., 1969; Nb2 lymphoma, Gout et al., 1997) correlated these features with malignant progression, fostering drug development efforts focused on specific nutrients. But resulting nutrient mimetics were systemically toxic (reviewed in Souba, W. W., 1993), and inexplicable variability among increasing numbers of tumor isolates eventually discouraged these endeavors. Only leukemia dependence on asparagine was successfully pursued to a molecular understanding and effective drug (Asparaginase, reviewed in Narta, et al., 2007).

The xCT cystine/glutamate antiporter is the major means of increasing cystine uptake and the rate limiting step for glutathione (GSH) synthesis in fibroblasts, rat hepatocytes, and Nb2 lymphoma (Bannai, S., and Tateishi, N., 1986; Gout et al., 1997). Dual roles in reactive oxygen species (ROS) neutralization and detoxification of xenobiotics such as chemotherapeutics make GSH an appealing drug target. But inhibitors of glutathione synthesis failed clinical trials due to toxicities related to systemic GSH depletion (reviewed in Hamilton and Batist, 2004). xCT may provide a target for cell-specific GSH depletion. Drug screens identified off target effects of the anti inflammatory pro drug Sulfasalazine (SASP) as an xCT inhibitor (Gout, P.W., et al., 2001). SASP, glutamate, monosodium glutamate, and chemical inhibitors of xCT reduce GSH, increase ROS, potentiate chemotherapeutic effects, and attenuate growth in a handful of tumor-derived cell lines *in vitro* and xenografts (reviewed in: Lo et al. 2008a). SASP is labile and insoluble under physiological conditions, limiting anti-xCT use to preclinical experiments. Other effects ascribed to SASP include the on-target anti inflammatory activity of an SASP metabolite, NFkB inhibition, and direct interaction with GSH in cell free extracts.

Molecular explanations for glutamine reliance remain elusive although the phenomenon is well described (Coles and Johnstone, 1962; Kovacevic and Morris, 1972; Reitzer et al., 1979; DeBerardinis et al., 2007; Yuneva et al., 2007; Wise et al., 2008). Glutamine provides

carbon and nitrogen for independent metabolic events, either directly, (*e.g.* nucleotide and protein synthesis), via the de-amidated product glutamate (*e.g.* polysaccharide synthesis, membrane antiporter activities), or via further glutamate deamination to 2-ketoglutarate (2-kg; *e.g.* respiratory/TCA cycle substrates; reviewed in Deberardinis and Cheng 2010). Abundant serum levels maintained by skeletal muscle reserves allow most cells to be glutamine consumers, although they may also be capable of synthesis (reviewed in Curthoys and Watford, 1995; Kovacevic and McGivan 1983). Glutaminase (GLS; *GLS*) and glutamine synthase (GS; *GLUL*) modulate intracellular glutamine/glutamate levels; GLS deamidates glutamine, producing glutamate and ammonia, while GS synthesizes glutamine from these products. Reciprocal expression precludes futile substrate cycling (Curthoys and Watford, 1995; Kovacevic and McGivan 1983). *GLS* expression levels were correlated with proliferation rate, respiratory glutamine use, and environmental glutamine reliance (Knox et al., 1970; Linder-Horowitz et al., 1969; reviewed in Wise et al., 2008). Thus *GLS* is a commonly proposed biomarker of glutamine-dependence and therapeutic target (Lobo et al., 2000; Lora et al., 2004; Wang et al., 2010; Yuneva et al. 2007; van den Heuvel et al., 2012), and *GLUL* a marker of glutamine independence (Collins et al., 1998; Kung et al., 2011).

Resurgence of interest in nutrient reliance followed realizations that oncogenes can direct nutrient uptake and dependence (reviewed in Wise and Thompson 2010). But as in other preclinical discoveries, findings in exemplar cell lines do not identify appropriate patient populations or estimate their sizes. For example, the metabolic effects of oncogenic Myc vary substantially between tissue types (Yuneva et al., 2012), making a simple cause-effect relationship between oncogenic Myc and glutamine dependence unlikely. Nor does restricting expectations to tumors of one tissue type improve the probable efficacy; in singular glioma lines oncogenic Myc confers glutamine reliance (Wise et al., 2008), but studies of multiple glioma lines report little glutamine dependence (Dranoff et al., 1985). Also, naturally-arising tumors without dominant oncogenic driver may overcome nutrient scarcity by switching nutrient sources (Zielke et al., 1978), attenuating cell cycle progression (Jones et al., 2005), or other activities reported in non-transformed cells. Finally, nutritional requirements of tumors versus proliferating normal cells, rather than quiescent tissues have seldom been reported (exceptions: Iglehart et al., 1977; Jelluma et al., 2006), but are a critical part of the therapeutic development puzzle. Here we present analyses of metabolic activities implied by microarray data, and identification of therapeutic targets enriched in basal and claudin low TNBC.

## RESULTS

Expression profiles of culture adapted, proliferating non-tumorigenic cells (human mammary epithelial cell derivatives; HMECd); freshly purified normal breast epithelia; and purified tumor cells from patient pleural effusions were derived and merged with previously published expression profiles of 45 independently-derived breast carcinoma cell lines (Supplemental Methods, Neve et al., 2006). These represent all major breast cancer subtypes and common breast oncogenes in their natural genetic contexts (Figure 1A; Table S1, media, and name abbreviations). Significance analysis contrasting purified tumors and tumor-derived cell lines against purified normal breast epithelia and HMECd lines identified about 760 differentially expressed probeset IDs (>30%) encoding metabolic proteins (Figure S1A; Table S2).

### Nutrient Preference Varies Widely Among Breast Tumors

Elevated glucose consumption relative to adjacent quiescent tissue is a canonical hallmark of tumors, but whether this is due to proliferative glycolytic demands or specific oncogenic activities is unclear. In analysis of *in vitro* glucose uptake rates by tumorigenic versus

HMECd lines, we found highest glucose consumption in luminal carcinoma-derived isolates (Figure 1B). Claudin low TNBC and about 1/3 of basal samples consume as little or less glucose than HMECd, although they preserve many aspects of the aggressive tumors from which they are derived; (e.g. similar molecular signatures (Neve et al., 2006), rapid doubling times, (Figure 1C) and extracellular matrix invasiveness (Sommers et al., 1994, Han et al., 2010)). Thus glucose consumption varies widely among breast isolates, and tumorigenic lines do not necessarily consume more glucose than non-tumorigenic proliferating cells.

Glutamine is an alternate bioenergetic substrate for many metabolic processes. In amino acid depletion analyses, we found that most basal and claudin low TNBC consume more glutamine than the luminal or HMECd samples (Figure 1D). However, at least 4 claudin low TNBC consume little glutamine (black triangles), and do not significantly increase consumption of another amino acid over that of the HMECd lines, with the possible exception of cystine (Figure 1E). Thus while nutrient preference often associates with molecular phenotype, the 4 claudin low exceptions reveal this as a generalization. Significantly enhanced nutrient consumption may not be an absolute requisite of aggressive breast tumors.

### Reduced *hGAC* Expression Identifies Luminal Breast Carcinomas

We tested historical associations between glutamine consumption and glutaminase expression in our cells. Probeset IDs targeting most portions of *GLS* ( $p=0.6, 0.9, 0.4$ ), and total *GLS* protein levels (Figure S1B,  $p=0.19$ ) are not statistically different between tumor molecular subtypes. But a *GLS* carboxy terminal splice variant (*hGAC*) is reduced in luminal carcinomas (Figure 1F; *hGAC*: 221510\_s\_at;  $p=3.1E^{-9}$ ; Elgadi et al., 1999; Figure S1C). *hGAC* but not other *GLS* probeset ID signals are also lower in ER<sup>+</sup> and luminal tumors compared to ER<sup>-</sup> and basal tumors in 8/8 clinical breast tumor microarrays examined (Figure 1G; Table S3). Thus reduced *hGAC* expression is a strong indicator of luminal carcinoma identity (t-test luminal vs. all  $p=4.1E^{-13}$ ). While *hGAC* expression and glutamine consumption modestly correlate (Figure 1F,  $p=0.005$ ), the exceptions in our panel (black icons between dotted vertical lines) reveal that *hGAC* and *GLS* probeset IDs poorly identify high glutamine consumers.

### Glutamine Restriction Slows Expansion of Most Breast Cell Lines

Comparison of glutamine restriction responses between tumorigenic and HMECd samples revealed that 68% of luminal and 54% of basal TNBC samples were more restriction-resistant than HMECd (Figure 2A). Restriction deficits were not rescued by increasing the glucose concentration 2 or 5 fold (Figure 2B, 2X glucose; 5X not shown), suggesting that cells do not simply switch nutrients like fibroblasts and Erlich ascites (Zielke et al., 1978; Kvamme and Svenneby, 1961), to exhaust media glucose. Growth curves of HMECd and similarly sensitive tumor lines revealed that glutamine restriction simply slows culture expansion of each cell type (Figure 2A, examples at arrows; Figure 2C; Figure S2A). Unlike glucose restriction, glutamine restriction produces little AMPK activation (T-172 phosphorylation) indicative of ATP depletion, and little ACC phosphorylation that would inhibit fatty acid synthesis (Figure 2D). Only a modest increase in cell number / ATP ratios (Figure 2C, Q- # / ATP) and little evidence of apoptosis by Annexin V staining (data not shown), PARP cleavage (Figure 2D), or nuclear morphology (Figures S2B-E) are seen. Day 5 cell cycle fractions and mitotic figure counts are also unchanged (Figure 2E). Culture confluence reduces S-phase fractions and glutamine sensitivity, indicating that proliferative drive imparts glutamine reliance (Figure 2E C vs. CF, % S-phase; Figure 2F). These data predict that normal proliferating breast progenitors and most breast tumors would survive a glutamine restricting therapeutic by simply slowing expansion rates. Glutamine-free culture sizes do not correlate with glutamine consumption (Figure 2G,  $p=0.13$ ) or *hGAC* expression

(Figure 2H,  $p=0.014$ ). We conclude that historical correlations between these parameters are not applicable to breast tumors.

### Restriction Induces S-phase Stalling in a Subset of TNBC

Growth curves of the most restriction-sensitive tumors (Figure 2A, “Glutamine Sensitive” underbar) revealed cultures that A) continued expansion, similar to HMECd; B) did not significantly expand; and C) decreased (Figure 3A). Groups B and C (B+C) include two ER<sup>+</sup> (luminal) and 11 TNBC (3 basal, 8 claudin low) independently-derived samples, including the 4 claudin low cells that consume little glutamine (Figures 1D, black). Group C cells increase Annexin V reactivity (Figure 3B) and apoptotic figures (Figure S3A) on days 2–4 of restriction. Thus about 1/2 of our TNBC lines are unable to survive or expand without glutamine.

We tested whether the few live cells in day 5 Group B+C cultures had arrested in G1, reasoning that they might survive glutamine restriction to seed tumor recurrences, discouraging development of glutamine-restricting therapeutics. In complete media, nocodazole treatment increased G2/M and late S-phase fractions of all samples tested, demonstrating transit to and activation of an intact mitotic checkpoint (Figure 3C, gray bars; late S-phase data not shown; Figure S3B). Glutamine-free cultures of group A exemplars exhibited similar G2/M increases (gray vs. yellow bars), but not Group B or C samples. The unchanged S-phase fractions rule out G1 arrest by Group B+C samples (Figure 3D, paired gray vs. yellow bars). Their cell cycle profiles are identical with or without nocodazole treatment (Figure S3C) indicating S-phase stalling, and total and phosphorylated retinoblastoma proteins are reduced similar to S-phase stalling in DNA damage responses (Figure 3E, Knudsen et al. 2000). But like glutamine-restricted Myc-transformed fibroblasts,  $\gamma$ H2A.X phosphorylation is not increased, indicating that the intra-S-phase DNA damage checkpoint remains inactive (data not shown; Yuneva et al., 2007). Culture confluence reduces the S-phase content and glutamine sensitivity of all but two Group C samples (Figure 3F, colored vs. gray icons). However Group B+C samples are not simply the most rapidly dividing cells (Figure 3G; t-tests: all vs. C+B,  $p=0.11$ ; all basal and claudin low vs. C+B,  $p=0.2$ ), indicating that they harbor specific defects which makes them unable to surmount restriction.

### Known Regulators of Glutamine Metabolism do not Identify Group B or C Cells

We tested proposals that *hGAC* and *GLUL* identified glutamine dependent cells. While *hGAC* statistically identifies Group C ( $p=5.6\times 10^{-9}$ ) and Group B+C ( $p=0.008$ ) cells, only 9/13 (69%) samples expressing higher *hGAC* than HMECd cells are Group B or C (Figure 4A, above upper dotted line), and these levels are similar to purified normal epithelia (green squares). *hGAC* also poorly discerns Group C ( $p=0.03$ ) or B+C ( $p=0.17$ ) from all other TNBC. While *GLUL* levels correlate with restricted culture sizes (Figure 4B;  $p=0.005$  to  $2.3E^{-4}$ , 3 probeset IDs; Figure S4A), *GLUL* also more accurately discerns luminal from claudin low samples (Figure 4B;  $p=1.9E^{-5}$ ). At lower p-value *GLUL* discerns luminal from all basal + claudin low ( $p=2.5E^{-5}$  to  $1.9E^{-4}$ ), or ER<sup>+</sup> from ER<sup>-</sup> ( $p=4.4E^{-3}$  to  $1.2E^{-2}$ ) cell lines, and samples in 7/8 clinical expression datasets (Figure 4C; Table S4). Most Group B +C cells express less *GLUL* than normal samples (Figure 4D), but low expression is not unique to Group B+C (grey circles below lower dotted line). Nor can *GLUL* discern Group C ( $p=0.20-0.67$ ) or B+C samples ( $p=0.015-0.09$ ) from other TNBC. Thus *hGAC* and *GLUL* are not strong biomarkers for Group B or C type tumors.

Oncogenic Myc can drive glutamine uptake and dependence in exemplar fibroblasts and glioma (Wise et al., 2008; Gao et al., 2009; Yuneva et al., 2007). *CMYC* is enriched in our basal and claudin low cells ( $p=0.013$ ). But neither *CMYC*, other Myc family members, or

core MYC expression signature genes (Chandriani et al., 2009) are differentially expressed in Group C or group B+C cells versus other basal + claudin low cells (Figure S4B; Table S5). We found no correlation between *TP53* mutational status and Group B or C membership using the IARC TP53 Database (Supplemental Methods,  $p=0.7$ ; <http://p53.iarc.fr/CellLines.aspx>). Significance analysis contrasting gene expression in the Group C or B+C samples versus other basal and claudin low TNBC did not identify potential biomarkers or offer molecular explanations for S-phase stalling (data not shown).

### Group B and C Carcinomas are Glutamine Auxotrophs

Glutamine restriction reduces *hGAC* and *GLUL* mRNA levels in low-density cultures, while producing little change in GS protein levels (Figures 4E, 4F, S4C, S4D). Confluent cultures can induce *GLUL* mRNA (Figure 4E, e.g. M435), suggesting one mechanism for their starvation resistance. We conclude that proliferating breast tumors cannot induce *GLUL* to escape glutamine restriction.

Titration of 17 common carbon sources over 4 concentration logs were tested for rescue of an exemplar Group C carcinoma (M436) from glutamine restriction (Figure S4E). Neither these, or nitrogen sources ammonium chloride, choline chloride, or putrescine improved cultures (Figure S4F). Only glutamate (2–3 fold), oxaloacetate (2–6%), and dimethyl 2-ketoglutarate (2–10%; Figure S4G) increased ATP values slightly, but only glutamate increased viable cell numbers in multiple Group C cell lines (4–6%; Figure S4H).

Combining GS substrates, glutamate and nitrogen sources, did not further improve cultures (Figure S4I). We conclude it unlikely that other commonly available nutrients can substitute for glutamine during restriction, and that the Group C+B tumors are functional glutamine auxotrophs.

### Glutamine Auxotrophy Presents Therapeutic Opportunities

We tested three approaches to therapeutic development targeting auxotrophic TNBC: preventing glutamine access; inhibiting glutamine-dependent enzymes; and inhibiting activities requiring glutamine metabolites. Auxotrophs (Figure 5A) and basal carcinoma subsets in clinical microarray datasets (Figure 5B, example; Table S6) express multiple glutamine transporters. Thus we prevented glutamine access by treating cultures with the leukemia therapeutic Asparaginase, reducing asparagine and glutamine to their acidic derivatives (Figure S5A; Narta et al., 2007). This produced an apparent synthetic lethality equal to that of leukemia in all Group C and about 1/3 of Group B cells (Figure 5C,  $IC_{85}$  below dotted line; Asselin et al., 1989). Correlated Asparaginase sensitivities and glutamine-free culture sizes (Figure 5D,  $p=5.7 \times 10^{-6}$ ; Asparaginase  $IC_{84}$   $p=9.3 \times 10^{-9}$ , not shown) reveal that glutamine re-synthesis from the Asparaginase products glutamate and ammonia is uncommon. We propose that local asparaginase / glutaminase delivery would kill auxotrophic tumors without requiring selective identification and targeting of their potentially varied molecular defects. Cells relatively resistant to Paclitaxel or Doxorubicin are exquisitely Asparaginase sensitive, indicating that an asparaginase-like therapeutic could become a critical, independent alternative for drug resistant tumors (Figure 5E).

Analysis of  $^{13}C$ -5-glutamine-derived metabolites in the Group C TNBC M436 (Figure 5F; Table S7) revealed that 80% of intracellular glutamine is imported (all 5 carbon positions  $^{13}C$ -labeled). About 40% of TCA cycle metabolites and their derivatives are directly produced from this pool, and another third (27–30%) are partially  $^{13}C$  labeled. Glutamine restriction depletes these pools (Figure 5G) suggesting that inhibition of glutaminase (*GLS/hGAC*) or aminotransferases (ATs) might kill or slow growth of the auxotrophs. siRNA-mediated reduction of *hGAC* attenuated culture expansion of auxotrophs with high glutamine consumption rates (Figure 5H, M436, M231; Figure S5B), but provided

little efficacy against BT549, an auxotroph that consumes little glutamine (Figure 1D), or H1937, a Group A TNBC. In comprehensive tests, treatment with a broad spectrum inhibitor of amidotransferases including GLS, (6-diazo-5-oxo-L-norleucine; DON; reviewed in Souba, W. W., 1993) placed auxotrophs among the most sensitive samples (Figure 5C). We propose that inhibitors of single DON targets should be refined for use against auxotrophic TNBC.

### Glutamine is Required for ROS Control in TNBC

Finally, we tested the strategy of inhibiting an activity that requires glutamine metabolites. In the normal human fibroblast IMR-90, 1/3 of glutamine uptake supplies glutamate for xCT activity (Bannai and Ishii, 1988). Analysis of amino acid consumption revealed highly correlated cystine depletion and glutamate secretion in 27 of our lines (Figure 6A,  $p=8.8E^{-11}$ ; Figure S6A), suggesting xCT activity. Glutamine restriction strongly reduced exchange (Figure 6B), modestly decreased GSH levels (Figure 6C) and increased intracellular ROS by at least 30% in 8/19 TNBC (Figure 6D, light blue). This is partially corrected by the ROS scavenger N-acetylcysteine (NAC) in 12/13 samples (light gray). NAC does not allow culture expansion (Figure S6B), thus glutamine use for ROS control is common, but other glutamine-influenced factors are also required for auxotroph proliferation.

We directly assessed the xCT expression and function in TNBC that was implied by the glutamine restriction effects on ROS. Basal and claudin low lines overexpress the exchange-specific subunit *SLC7A11* (Figure 6E,  $p=0.06-7.4E^{-4}$ ; Figure S6C), the glutamate-cysteine ligase regulatory subunit of glutathione synthase (arrow; *GCLM*,  $p=0.011$ ), and a membrane interacting protein *CD44*  $p=0.005-5.9E^{-8}$ ; Ishimoto et al., 2011). Cystine consumption and *SLC7A11* mRNA levels correlate (Figures 6F, S6D), and siRNA-mediated reduction of *SLC7A11* mRNA increases intracellular ROS (Figure 6G, H). SASP treatment reduces cystine/glutamate exchange and GSH content (Figure 6B, 6C). 2-mercaptoethanol (2me) provides cystine as mixed 2me-cysteine disulfides (Ishii et al., 1981), and normalizes GSH levels, demonstrating SASP specificity for cystine and GSH production. In 18/19 TNBC, SASP increases endogenous ROS by at least 50% (Figure 6D, teal bars), which are reduced by NAC in 14/16 samples (dark gray bars). Using reagents for specific ROS species, we found that SASP increases hydroxyl radicals, in keeping with the expected effects of GSH depletion (Figure S6E; Franco et al., 2007). Thus the xCT antiporter is commonly expressed and functional in TNBC. HMECd express these genes (Figure 6E, columns "T") but is much less active (Figure 6A, green).

### SASP Treatment Attenuates Tumor Growth

In proliferation assays we found that SASP treatment dramatically reduces TNBC culture sizes with  $IC_{50}$  values modestly correlate to cystine uptake in complete media (Figure 7A,  $p=0.07$ ). Cultures are significantly restored by NAC (Figure 7B), and not effected by the active anti-inflammatory fragment of SASP, 5-Aminosalicylic acid (5-ASA; Figure S7A). Thus inhibition of cystine acquisition, not anti-inflammatory activity, is responsible for TNBC proliferative sensitivity. This concentration range (0.2 to 0.7 mM) is not far from serum concentrations measured in bowel inflammatory patients (0.18 mM; Guastavino et al., 1988). Under normoxic conditions (5%  $O_2$ ) SASP sensitivity increased 2–3 fold (Figure S7B), and SASP significantly slowed growth of an auxotrophic line xenograft (Figure 7C), indicating that xCT activity is also critical for growth *in vivo*. Accordingly, 8/20 anonymous TNBC clinical specimens strongly express xCT (Figure 7D; Figures S7C-K). TNBC can be treated with Carboplatin, and Carboplatin + SASP reduces the Carboplatin  $IC_{50}$  in 13/14 of our TNBC samples (Figure 7E). We propose that SASP be derived for clinical use.

## DISCUSSION

Rodent breast tumors (Erlch Ascites series) were instrumental in the definition of central metabolic pathways and tumor-specific aberrations, but work in human breast tumors is largely limited to aspects of fatty acid metabolism (see Menendez and Lupu, 2007). Reports of other metabolic features are less frequent and use only one or a few samples, producing biased conclusions due, for example, to the mistaken use claudin low lines to represent typical TNBC; misidentification of GeneChip probeset IDs that are *hGAC* splice variant specific as reporting total *GLS* mRNA; the lack of gene expression comparisons between tumors and normal breast epithelia; and the inability to directly compare non-tumorigenic breast derivative and tumorigenic behaviors (examples see Collins et al., 1998; Kung et al., 2011; Simpson, et al., 2011). Our data clarify these misunderstandings and provide a detailed nutrient utilization portrait of a comprehensive organ site-specific tumor collection, contrasting gene expression and functional assays to define common nutrient utilization patterns and responses to drugs that leverage associated metabolic activities.

### Historically-Associated Metabolic Features Vary Substantially in Breast

Doubling time, glutamine consumption, and glutamine reliance are historically correlated. Among this triad, only doubling time and glutamine-free culture sizes modestly correlate across our large sample collection (Figure 3G,  $p=0.002$ ). But the glutamine auxotrophs are not simply the most rapidly dividing samples. Nor are they the largest glutamine consumers; 4/8 auxotrophic, claudin low samples consume no more glutamine than proliferating non-tumorigenic cells (Figure 1D, black triangles: BT549, H38, H100, M157). Glutamine can be cycled by import via ASCT2 and export in exchange for essential amino acids via the LAT1/4f2hc antiporter (*SLC7A5/SLC3A2*, Figure 7F, dark blue arrows; Nicklin et al., 2009). Our 4 low glutamine consumers express all antiporter components (Figure 5A), and glutamate cycling would not alter their measured ambient glutamine levels. Thus these cells may require glutamine to fuel both this exchange activity and the xCT antiporter, and use relatively less glutamine for respiration. This may explain the relative proliferative resistance to siRNA-mediated reduction of *hGAC* seen in BT549 (Figure 5H). Differences between glutamine cycling and catabolism may also partially explain historically variable correlations between glutamine uptake and glutamine reliance in other tumors.

Conversely, auxotrophs of high glutamine consumption (Figure 1D, M436) that require glutamine as a major respiratory fuel (Figures 5F, 5G; Figure 7F, light blue arrows) and for glutamate/cystine exchange (Figure 6B, 7F, gray arrows), may be more susceptible to inhibition of *hGAC* (Figure 5H, M436, M231) and subordinate glutamate-dependent activities such as aminotransferases (ATs; Thornburg et al., 2008). Thus within a single tumor cell line, multiple critical requirements for glutamine may exist and provide multiple therapeutic targets, either individually or in combination. We hypothesize that xCT inhibition may be further potentiated by limiting glutamate availability (Figure 7F).

### Historically-Proposed Genetic Indicators of Glutamine Reliance do not Define Auxotrophy

With the resurgent interest in tumor metabolism, metabolic genes such as *GLS* and *GLUL* have been re-asserted as potential therapeutic targets and biomarkers, but we find that therapeutic relevance is not so easily defined. Gene expression may suggest metabolic behaviors that are more likely active in specific tumor groups, such as a statistical association of *hGAC* with high glutamine consumption in basal and claudin low versus luminal tumors (Figures 1F). However neither *hGAC* nor *GLUL* defines high glutamine consumption or identifies the true auxotrophic Group B and/or C cells with appropriate sensitivity to be considered independent clinical biomarkers. We also find that responses to interruption of ongoing metabolic activities can vary substantially due to unknown cell-



intrinsic factors. For example individual tumors can respond to glutamine restriction by slowing culture expansion or stalling in S-phase and dying (Figure 3A, B, C). Molecular explanation(s) for S-phase stalling remain unclear, and may be due to tumor defects far removed from direct glutamine interaction.

### **xCT is a Compelling Therapeutic Target for Triple Negative Tumors**

Inhibitor and RNAi studies reveal xCT induction as the dominant means of increasing cystine acquisition for GSH synthesis (reviewed in Lo et al. 2008a). Thus xCT may be a target for cell-specific GSH depletion, since SASP and other xCT inhibitors can slow growth of exemplar cell lines in xenograft without significant effects on other organs, and can cooperate with chemotherapeutics such as Cisplatin (Okuno, et al., 2003), Geldanamycin (Huang et al., 2005), Doxorubicin (Narang, et al., 2007) and Gemcitabine (Lo, et al., 2008b). However the SASP structure is labile, designed to be cleaved by enteric bacteria to release an active anti-inflammatory fragment. It is also insoluble in aqueous solutions and not optimized for the fortuitous interaction with xCT. Thus while direct clinical applications to TNBC are unrealistic, SASP is a strong lead compound for development of xCT inhibitory therapeutics. Our studies reveal that *SLC7A11* expression, cystine/glutamate exchange activity (Figures 6E, 6A, 7D), and deleterious proliferative effects of xCT inhibition are common in basal and claudin low carcinomas (Figure 7A, C). *CD44* and the claudin low gene expression signature associate with breast cancer stem-cell phenotypes (Hennessy et al., 2009, Prat et al., 2010), implying that SASP-derived therapeutics may target breast tumor stem cells. This is reminiscent of CD44 and xCT dependent ROS regulation in gastric tumor progenitors (Ishimoto 2011). Thus we have identified a compelling therapeutic target commonly expressed by breast tumors of poorest prognosis, and a lead compound for rapid, effective drug development.

## **EXPERIMENTAL PROCEDURES**

### **Dataset Preparation**

See Supplemental Experimental Procedures.

### **Cell Culture**

Tumorigenic cell lines were adapted to RPMI or DMEM + 5% Fetal Bovine Serum (GIBCO 11875, 11965; Table S2). Culture expansion assays performed at least 3 times in triplicate, in 96-well format. Relative cell number determined (Cell Titer Glow, Promega), verified by microscopy. Averages reported  $\pm$ SD. (See Supplemental Experimental Procedures, and below).

### **siRNA Effects**

Transfections (Oligofectamine, Life Technologies 12252-011) used *SLC7A11* (SilencerSelect Validated s24291, Life Technologies), *hGAC* (Dharmacon custom synthesis, sense: GGAAAGUCUGGGAGAGAAAUU, antisense: UUUCUCUCCAGACUUUCCUU), or nonspecific siRNAs (sc-37007, Santa Cruz Biotechnology; SN-1002, Bioneer), in triplicate sub-confluent 6-well or 96-well plates and the Life Technology protocol. RNA and ROS quantitation at day 2.

### **Glucose Uptake**

Cultures in DMEM/low glucose (GIBCO 11885), RPMI, or HMEC (Medium 171, Cascade Biologics), were treated  $\pm$  2-NBDG or 6-NBDG glucose (30 $\mu$ M, Molecular Probes N13195, N23106) for 0–8 hrs, harvested, external fluorescence quenched (0.4% trypan blue), 30,000 cells analyzed in triplicate FACSCalibur (Becton Dickinson) or C6 Flow

Cytometer (Accuri). Average mean fluorescence values at 4 hours normalized to unstained controls are reported  $\pm$ SD.

### ROS Detection

Cells were incubated 15 min. with 10  $\mu$ M 2',7'-dichlorofluorescein diacetate (DCFH-DA, Sigma D6883), or 1 hour with 5  $\mu$ M 3'-(p-hydroxyphenyl) fluorescein (HPF, Molecular Probes H36004), harvested, and 30,000 cells analyzed in triplicate by FACS, normalized to unstained controls. Average mean fluorescence values reported  $\pm$ SD.

### GSH Quantitation

Used the ApoGSH Glutathione Detection Kit (BioVision) per manufacturer's instructions in triplicate. 2-me at 60  $\mu$ M. Average values reported  $\pm$ SD.

### Amino Acid Analysis

Supernatants from 24 hr sub-confluent duplicate or triplicate cultures and cell-free media were analyzed using standard HPLC techniques (Biochemical Genetics Laboratory, Stanford University; UC Davis Genome Center, UC Davis). Values subtracted from media controls, normalized to cell number. Average values reported  $\pm$ SD.

### Metabolite Analysis

Cells were cultured in the presence of  $^{13}$ C-5 labeled glutamine (Cambridge Isotope) for 0–12 hrs, PBS washed, frozen (dry ice), lyophilized, pellets weighed, and homogenized in cold 60% acetonitrile (40  $\mu$ l per 1mg of protein with acetonitrile washed glass beads. Samples incubated 30 min/–80°C, supernatants collected, pellets washed (60% acetonitrile). Pooled supernatants lyophilized, re-suspended in 200  $\mu$ l H<sub>2</sub>O, and 40  $\mu$ l mixed with 30  $\mu$ l of 40% TCA and 50  $\mu$ l of 0.1 mM noreleucine (Sigma; internal standard). Lyophilized samples were silylated (50  $\mu$ l acetonitrile: MTBSTFA (N-methyl-N- [tert-butyl-dimethylsilyl]trifluoroacetamide, Regis Chemical, Morton Grove, IL, v/v 1:1), sonicated 3 hours, incubated overnight. Analysis used a PolarisQ GC-ion trap mass spectrometer (ThermoFinnigan, Austin, TX) as previously described (Yuneva et al., 2012). Metabolites identified and quantitated using XCalibur software (ThermoFinnigan). Results normalized to dry pellet weight, and noreleucine standard. Average values reported  $\pm$ SD.

### Immunohistochemistry

Cell lines and anonymous, de-identified tumor sections (UCSF/SPORE Tissue Core, collected under UCSF Internal Review Board approval) with high and low *SLC7A11* values (Chin, et al., 2006), were stained to correlate anti xCT reactivity (Novus Biologicals NB300-318) with *SLC7A11* mRNA levels (data not shown). Detection used citrate antigen retrieval, ABC Kit (Vector Labs), and the Novus antibody-specific protocol. Commercial tissue arrays of anonymous breast tumor and normal sections with known ER/PR/Her2 status were purchased and analyzed (Biomax, Inc).

### Bioinformatics

Association of *GLS* and *GLUL* expression with ER status and molecular subtype was determined in clinical microarrays available via <http://www.ncbi.nlm.nih.gov/gds>. Data were preprocessed (RMA algorithm in R), analyzed with Matlab R2011a and R version 2.12.0 for MacOS X. Pearson correlations reported, class distinctions by Student's t-test.

## Xenografts

The claudin low auxotroph M231 was implanted into mammary fatpad 4 in 14 6-week old NSG (NOD.Cg-Prkdc<sup>scid</sup> Il2rg<sup>tm1Wjl/SzJ</sup>) female mice. Animals were randomized at day 16 and injected IP twice daily with 250  $\mu$ l Saline or 50mM SASP in 0.1N NaOH pH 7.5 from days 17–31 (Guan, et al., 2009). Tumor volume measured twice weekly, average values reported  $\pm$ SD. Experiments performed following UCSF Institutional Animal Care and Use Committee approval, in accordance with institutional and national guidelines.

## Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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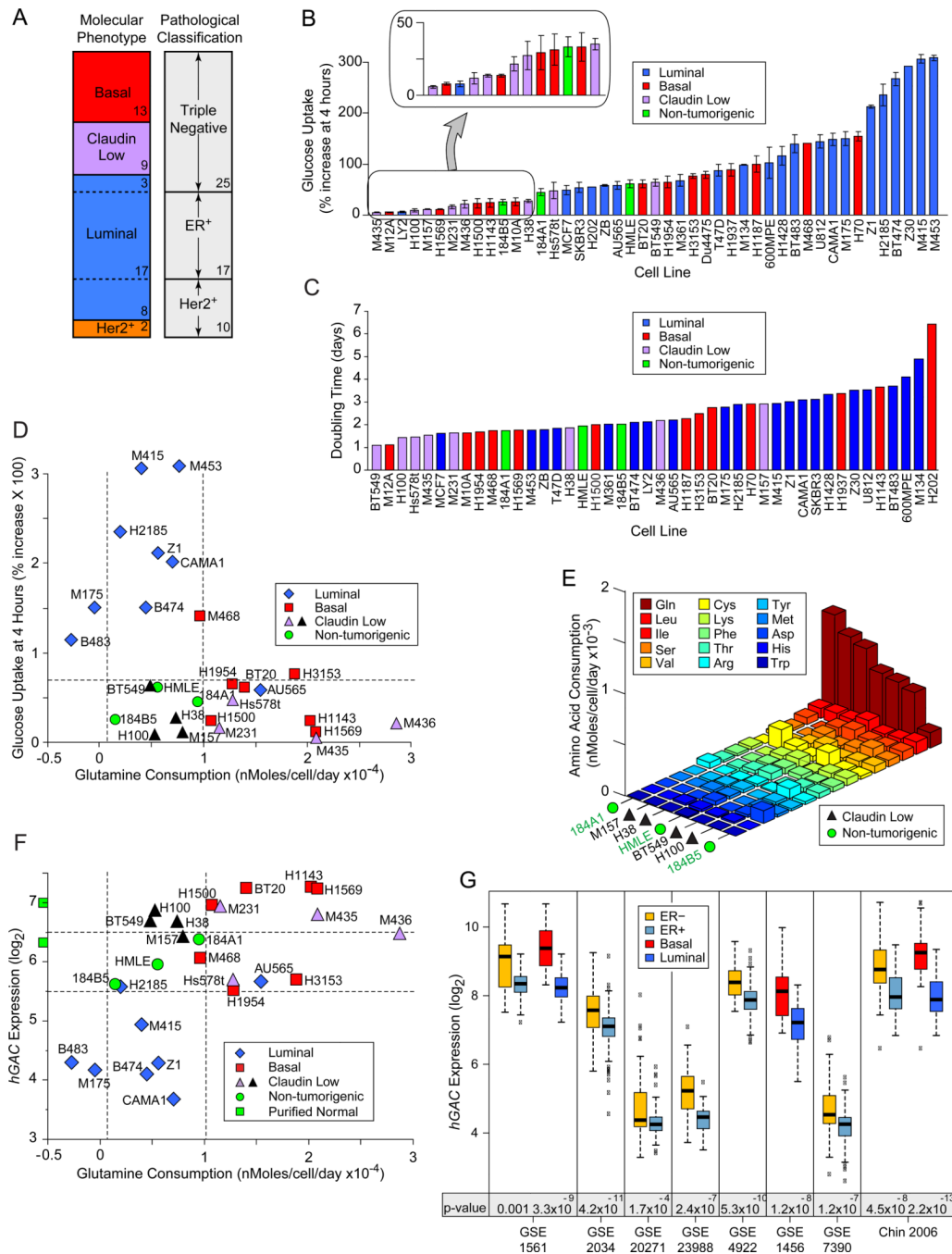
### SIGNIFICANCE

There is a strong disconnect between compound efficacy in tumor cell lines used for cancer drug development versus clinical response rates, slowing the production of effective therapeutics. This would be improved if the frequency and types of tumor responses to a particular perturbation could be identified early in the process. While drug target expression is currently used to identify applicable clinical populations, these patient cohorts contain both responders and non-responders. Here we use functional analyses in 47 independent breast-derived cell lines to measure metabolic responses related to perturbations in glutamine metabolism, and estimate their frequency. We identify a therapeutic target in a severely underserved population of breast cancer patients, and a lead compound for rapid, durable therapeutic development.

**HIGHLIGHTS**

- Most breast tumors survive glutamine restriction, limiting its therapeutic use
- A subset of triple negative breast tumors are true glutamine auxotrophs
- Conventional biomarkers of glutamine reliance do not identify true auxotrophs
- Triple negative tumors require cystine import via the xCT transporter

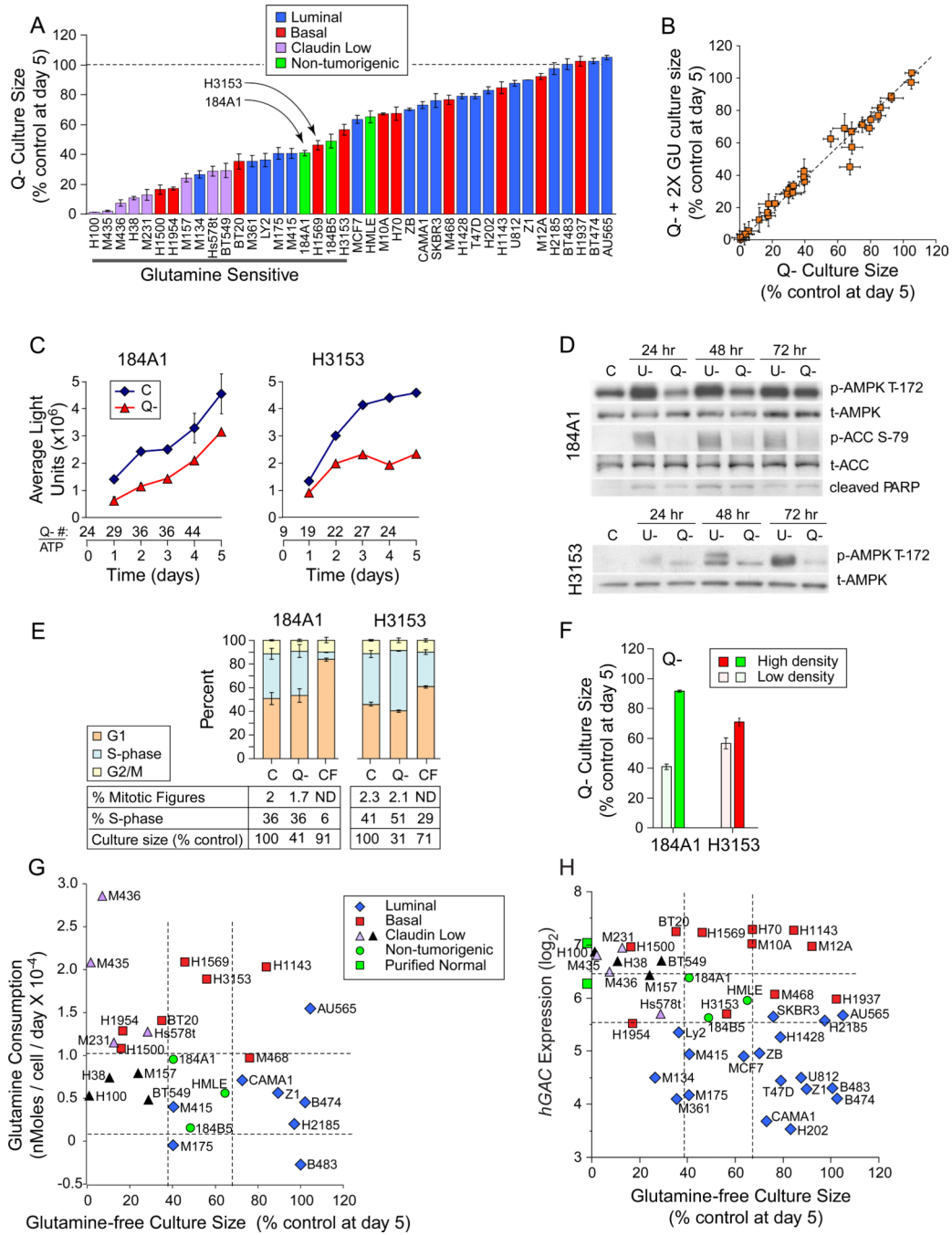




**Figure 1. Nutrient Consumption in Breast-Derived Cell Lines**

Icon codes in figure keys; dotted lines bracket proliferating, non-tumorigenic sample values. Icons represent mean values  $\pm$  SD. (A) Comparison of two nomenclatures used to describe samples in our study. Sample numbers of each type indicated. (B) Fluorescence increase of cell lines after 4 hour culture with 2-NBDG or 6-NBDG -labeled glucose relative to unlabeled cultures. (C) Population doubling times, calculated from standard growth curves. (D) Glucose uptake at 4 hrs (from part B) vs. glutamine consumption, derived from media depletion at 24 hours culture, normalized to cell number. (E) Amino acid consumption by 4 claudin low samples that consume little glucose or glutamine compared to HMECd samples. Values derived as in D; standard three letter amino acid codes in key. (F) Glutamine

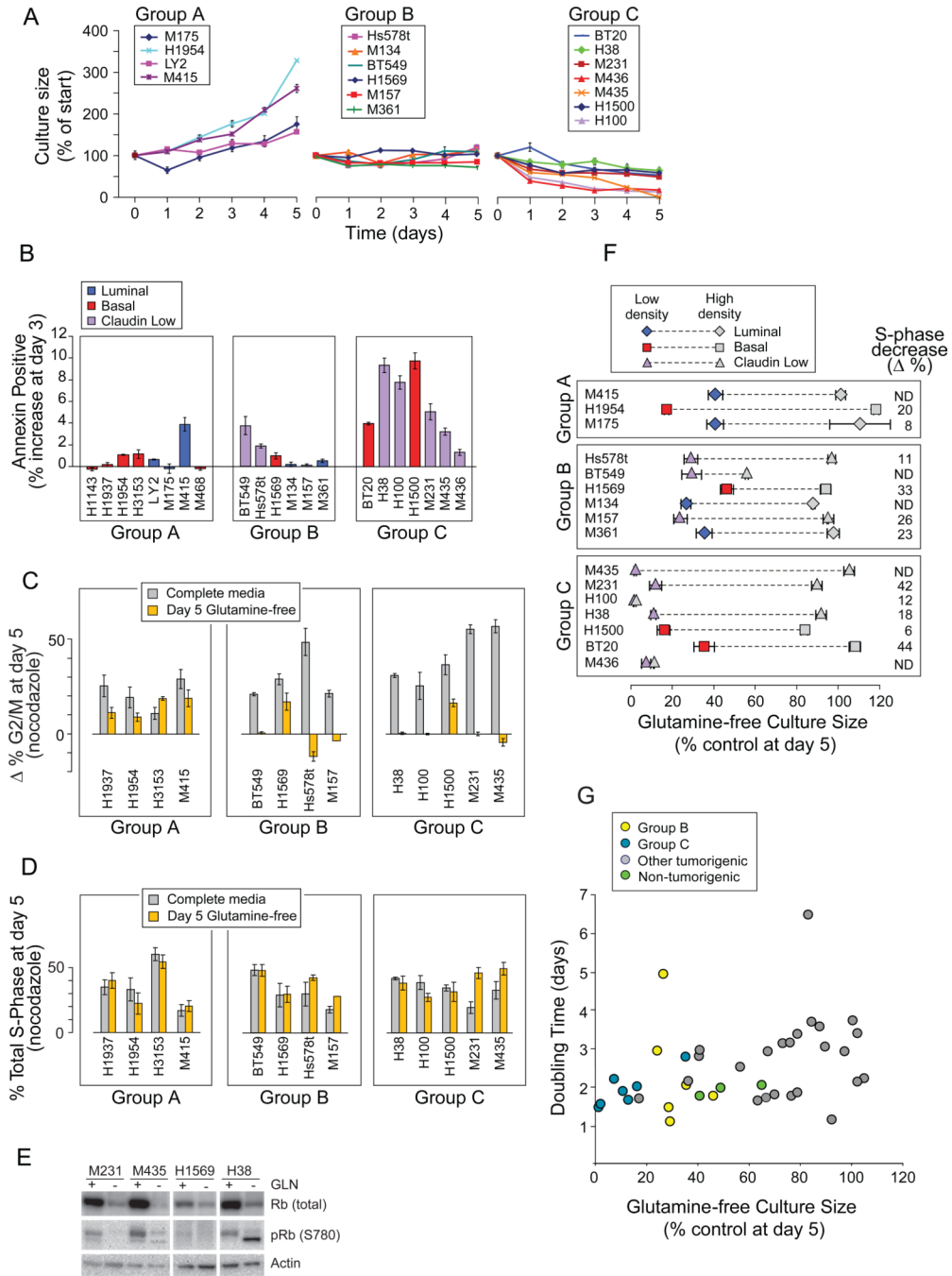
consumption at 24 hrs vs. *hGAC* GeneChip hybridization signal. Green squares on y-axis are the average *hGAC* signals from 3 CD10<sup>+</sup>, and 3 BerEP4<sup>+</sup> purified normal breast samples. (G) Differential *hGAC* expression by basal vs. luminal or ER<sup>+</sup> vs. ER<sup>-</sup> samples in 8 clinical breast tumor datasets, downloaded from NCBI GEO and Chin 2006 (Chin et al., 2006). t-test p-values below paired box plots. See also Figure S1, and Tables S1, S2, S3.



**Figure 2. Glutamine Restriction Slows Culture Expansion**

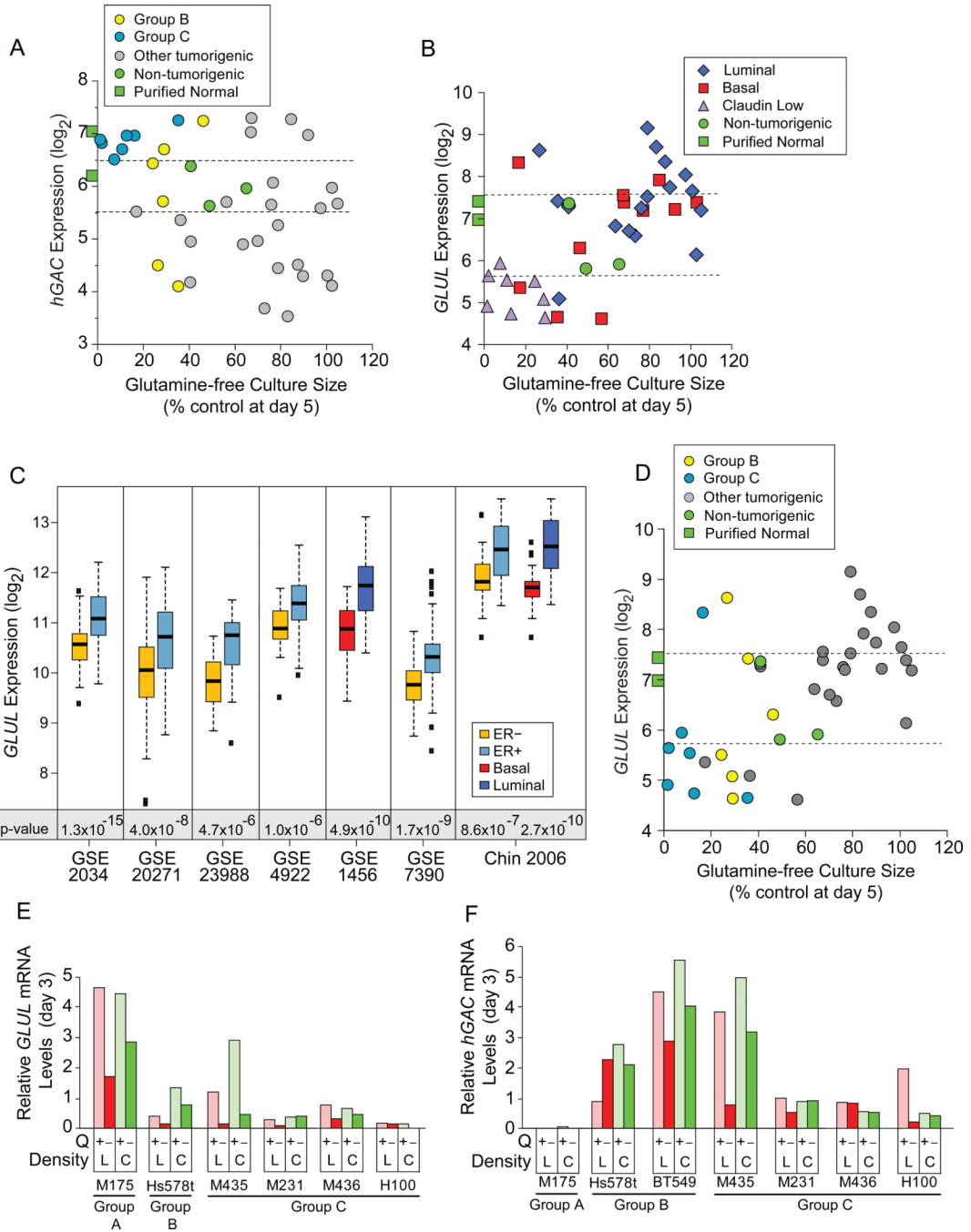
Icon codes in figure keys; dotted lines bracket non-tumorigenic sample values; C, complete media; Q-, glutamine-free media; U-, glucose free media. Icons represent mean values +/-SD. (A) Day 5 culture sizes for each cell line grown in glutamine-free media, normalized to culture in control media. (B) Day 5 culture sizes in glutamine-free media with twice the normal glucose concentration (2X GU, y-axis) vs. glutamine-free media with normal glucose levels (x-axis), each normalized to culture in control media. (C-F) Glutamine deprivation responses in the non-tumorigenic exemplar 184A1 and a similarly-sensitive tumorigenic line H3153 (arrows, panel A). (C) Growth curves derived from Cell Titer Glow/ATP content analysis. Numbers below the x-axis, ratio of cell number derived from manual

counting (trypan blue) / ATP values. (D) Comparison of AMPK activating phosphorylation, PARP cleavage, and ACC inhibitory phosphorylation. (E) Cell cycle distribution, mitotic figure counts, S-phase fractions, and culture sizes at day 5 culture in indicated conditions. CF, confluent cells in complete media. (F) Day 5 culture sizes differences for high density vs. low density cultures in glutamine-free media. (G) Glutamine consumption (from Figure 1D) vs. glutamine-free culture sizes from part A. (H) *hGAC* GeneChip hybridization signal vs. glutamine-free culture sizes from part A. Green squares on y-axis are the average *hGAC* hybridization signals from 3 CD10<sup>+</sup>, and 3 BerEP4<sup>+</sup> purified normal breast samples. See also Figure S2.



**Figure 3. Glutamine Restriction Induces S-phase Stalling in a Subset of Basal TNBC**  
 Icon codes in figure keys. Icons represent mean values  $\pm$ SD. (A) Growth curves of “Glutamine Sensitive” carcinomas (underlined in Figure 2A) in glutamine-free media. (B) Percent increases in Annexin V reactivity of cells in glutamine-free media at day 3. Group averages; A, 0.8%,  $\pm$ 1.4; B 1.2%  $\pm$ 1.4; C, 5.8%  $\pm$ 3.2; t-test A vs C  $p$ = 0.005. (C) Paired bars representing the change in percent of cells in G2/M ( $\Delta\%$  G2/M) with nocodazole treatment at day 5 in control (gray) versus glutamine-free (yellow) media, using cell cycle curve fitting software (FLOJO, Treestar). (D) Paired bars representing the percent S-phase fraction with nocodazole treatment of day 5 cultures in control (gray) vs. glutamine-free (yellow) media. (E) S phase stalling is accompanied by a decrease in total and Serine 780

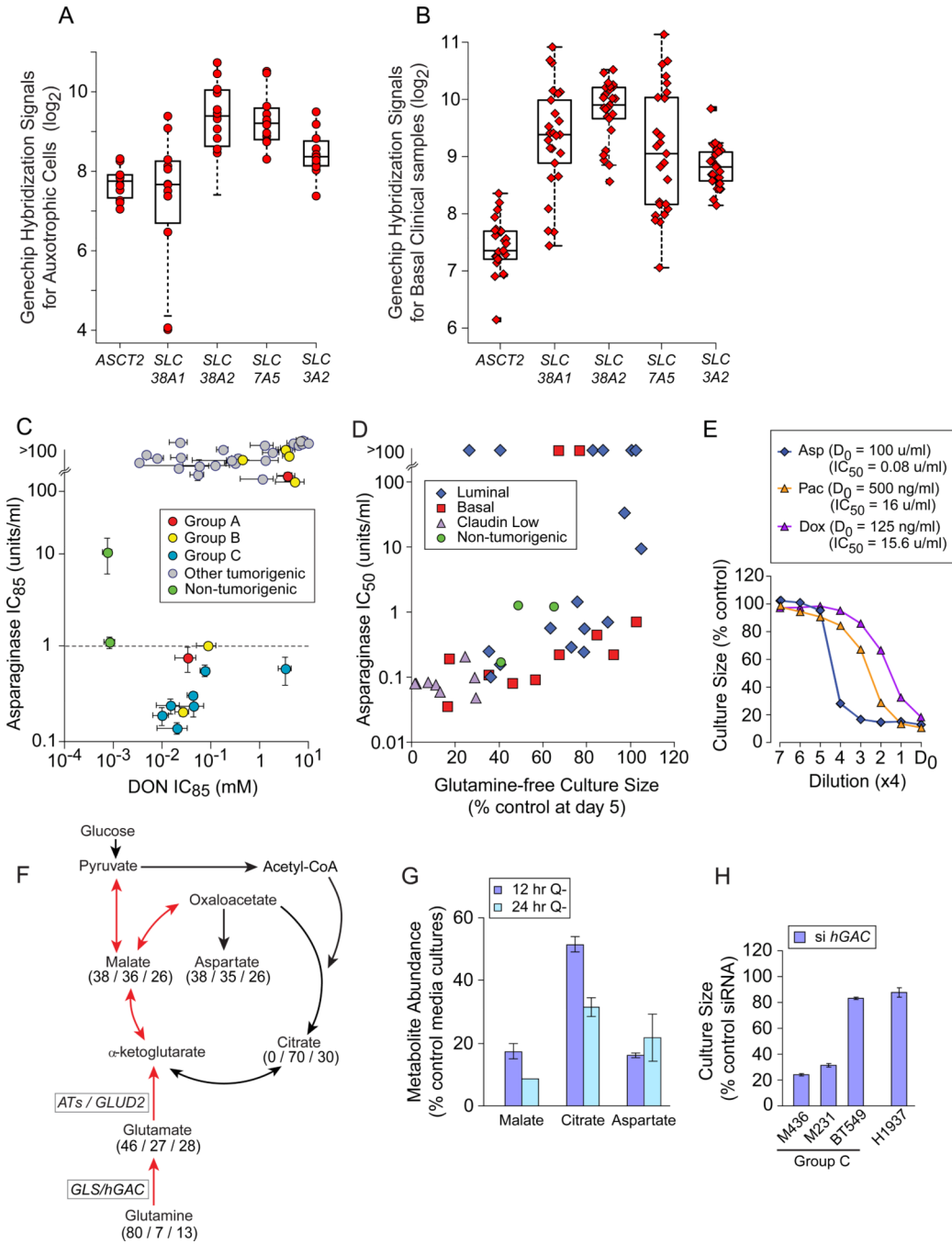
phosphorylated retinoblastoma protein. (F) Culture confluence reduces S-phase fractions and glutamine sensitivity; S-phase decrease ( $\Delta\%$ ), is the decrease in % S-phase with high density culture (gray icons) versus low density culture (colored icons); paired icons connected by dashed lines represent a single cell line. (G) Doubling time (from Figure 1C) vs. glutamine-free culture sizes (from Figure 2H). See also Figure S3.



**Figure 4. Common Regulators of Glutamine Metabolism do not Identify Auxotrophic Cells**  
 Icon codes in figure keys; green squares, average hybridization signals from 3 CD10<sup>+</sup>, and 3 BerEP4<sup>+</sup> purified normal breast samples. Icons represent mean values  $\pm$  SD. (A) *hGAC* GeneChip hybridization signal ( $\log_2$ ) vs. glutamine-free culture sizes (from Figure 2H) coded as restriction Groups B and C vs. others. (B) *GLUL* GeneChip hybridization signal ( $\log_2$ ) vs. day 5 glutamine-free culture sizes, coded by molecular subtype, dotted lines bracket proliferating, non-tumorigenic sample values. (C) *GLUL* expression by basal vs. luminal or ER+ vs. ER- samples in 8 clinical breast tumor expression datasets, downloaded from NCBI GEO and Chin 2006 (Chin et al., 2006); t-test p-values below paired boxplots.

(D) Correlation of glutamine-free culture sizes and *GLUL* expression as in panel B, but coded by restriction groups. (E, F) Comparison of (E) *GLUL* and (F) *hGAC* mRNA levels at day 3 in glutamine replete versus deficient media, from quantitative PCR analysis; L, low density; C, confluent; Q, glutamine. See also Figure S4 and Tables S4, S5.

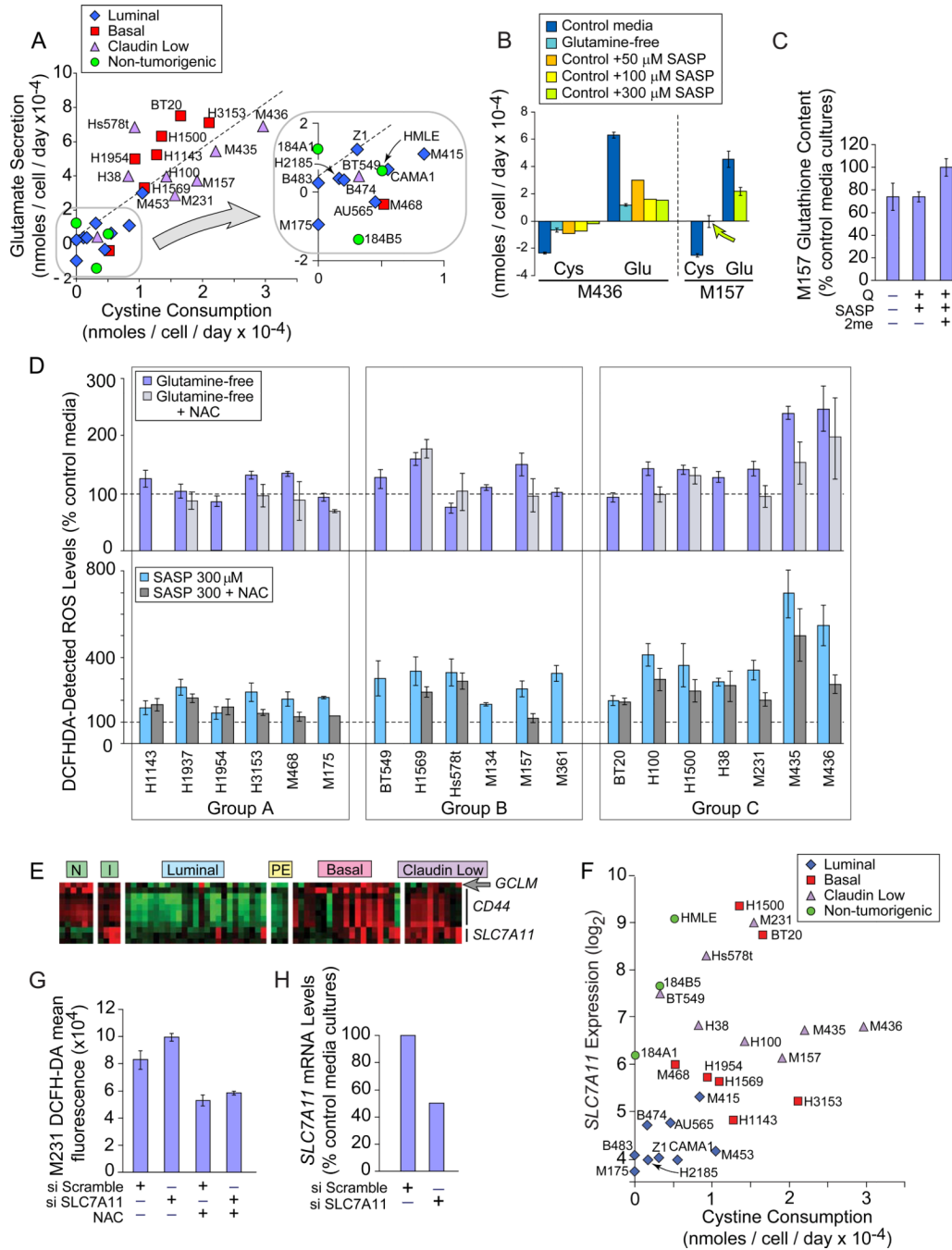




**Figure 5. Glutamine Auxotrophy Presents Therapeutic Opportunities**

Icons represent mean values  $\pm$  SD. (A) GeneChip hybridization signals for 4 glutamine transporters and the common heavy chain (*SLC3A2*) in glutamine auxotrophic cells. (B) GeneChip hybridization signals for transporters as in panel A, for basal carcinoma subsets of clinical datasets downloaded from NCBI GEO and Chin 2006 (Chin et al., 2006), 1 example dataset shown. (C) Relative Asparaginase (y-axis), and DON (x-axis) sensitivities ( $IC_{85}$ ) of our cell panel, coded by restriction Groups B and C vs. others; dotted line, Asparaginase concentration used to kill sensitive leukemia cells *in vitro* (1u/ml). (D) Day 5 glutamine-free culture sizes (from Figure 2A) vs. Asparaginase sensitivity ( $IC_{50}$  shown). (E) Four fold drug

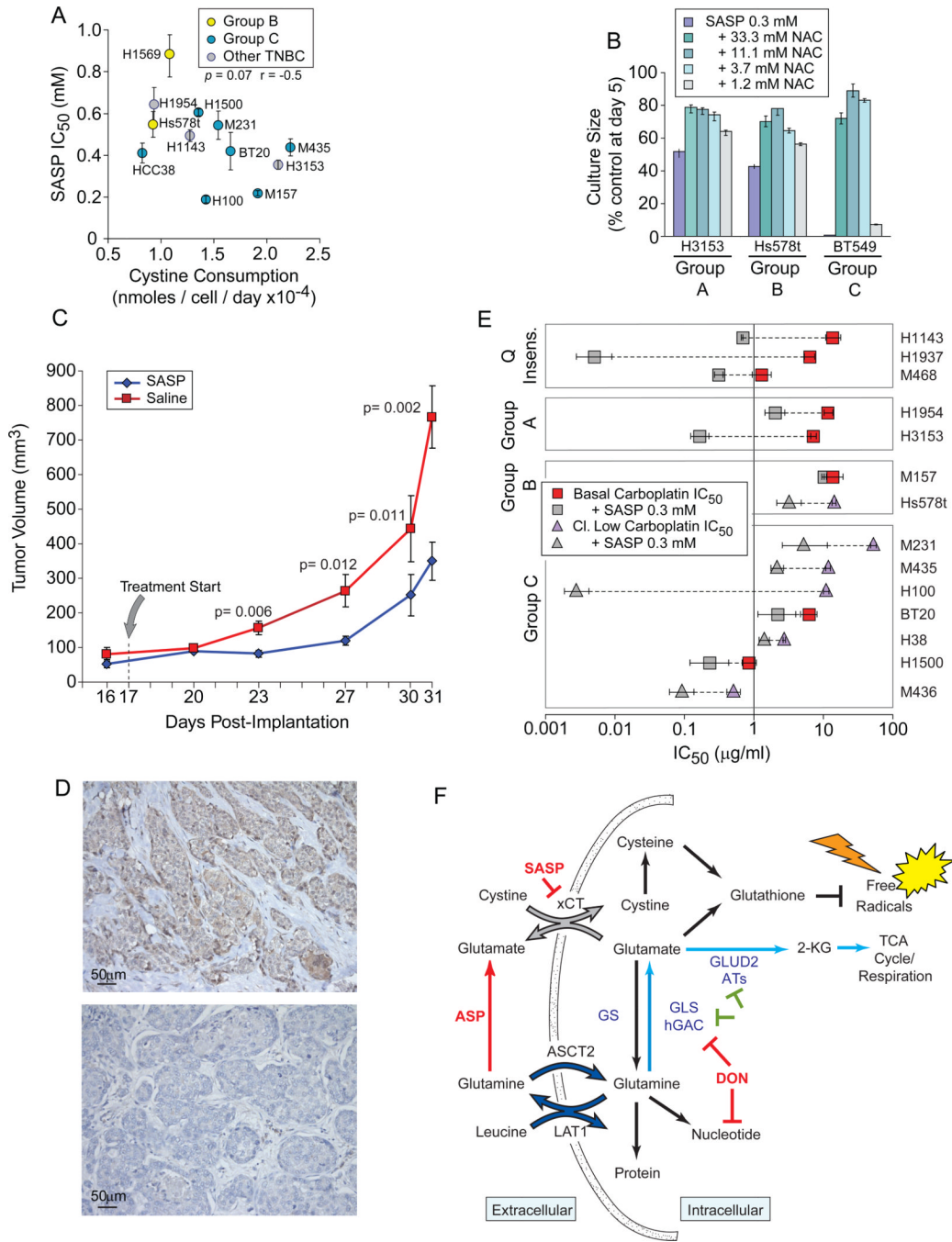
titrations and calculated  $IC_{50}$ s for an exemplar Group C auxotroph (M436).  $D_0$ , highest drug concentration and calculated  $IC_{50}$ s in figure key; Asp, Asparaginase; Pac, Paclitaxel; Dox, Doxorubicin. (F) TCA cycle diagram illustrating respiratory use of glutamine in red arrows. Numbers indicate mass spectroscopy determination of the percent of each metabolite that contains (all / several / no)  $^{13}C$ -carbons derived from culture with  $^{13}C$ -5-glutamine in M436. (G) Decrease in key TCA cycle metabolite pools with glutamine restriction, expressed as % control media cultures; Q-, glutamine-free media. (H) Proliferative effects of siRNA-mediated *hGAC* mRNA reduction in exemplar cell lines, expressed as a percent of transfection with a scrambled siRNA. See also Figure S5, Tables S6, S7.



**Figure 6. Glutamine Restriction and xCT Inhibition Increase ROS**

Icon codes in figure keys; NAC, N-acetylcystine; SASP, Sulfasalazine. Icons represent mean values  $\pm$  SD. Amino acid quantitation by HPLC. (A) Change in media cystine (x-axis) and glutamate (y-axis) concentrations of cells cultured 24 hours in control media. (B) 24 hrs of glutamine restriction or SASP treatment reduces cystine / glutamate exchange by exemplar Group C auxotrophs; cys, cystine; glu, glutamate. (C) Effects of 24 hour glutamine restriction or SASP treatment on GSH content in an exemplar Group C TNBC; Q-, glutamine-free media; SASP, SASP treatment in complete media; SASP + 2me, SASP treatment in the presence of beta mercaptoethanol. (D) ROS levels in basal carcinomas assessed by DCFHDA fluorescence, normalized to control media reactivity. Light blue, 2

day cultures in glutamine-free media; Group averages; A, 112%  $\pm$  21; B, 121%  $\pm$  31; C, 162%  $\pm$  59; t-test group A vs. C  $p=0.07$ ; Group A vs. B+C  $p=0.074$ . Light gray, glutamine-free media +NAC. Teal, cultures treated 24 hours with SASP; Group averages; A, 205%  $\pm$  43; B, 287%  $\pm$  62; C, 405%  $\pm$  168; t-test Group A vs. C  $p=0.019$ ; Group A vs. B+C  $p=0.003$ . Dark gray, SASP +NAC. (E) Heatmap of genes involved in xCT function; red, increased; green, decreased; N, purified normal CD10<sup>+</sup> and BerEp4<sup>+</sup> breast epithelial cells; I, proliferating non-tumorigenic cell lines; PE, ER<sup>+</sup> tumor cells purified from pleural effusions. (F) *SLC7A11* GeneChip hybridization signal ( $\log_2$ ) vs. cystine consumption, icons coded by molecular subtype. (G) ROS levels in M231, 48 hours after targeting *SLC7A11* or a scrambled siRNA, in the presence or absence of N-acetylcystine (NAC). (H) *SLC7A11* knockdown efficiency of siRNAs used in part G. See also Figure S6.



**Figure 7. SASP Attenuates Proliferation *In vitro* and *In vivo***

Icon codes in figure keys. Icons represent mean values  $\pm$  SD. (A) Cystine consumption in complete media derived from HPLC analysis (x-axis) versus SASP sensitivity (IC<sub>50</sub>). (B) NAC treatment rescues SASP-induced culture size defects in an exemplar cell from each restriction group A-C. (C) SASP treatment attenuates xenograft growth; Group average tumor volumes separation p-values noted on graph. (D) Examples of xCT expression in exemplar human TNBC tumor sections; nuclei, blue; xCT-specific HRP signal, brown Upper positive, lower negative. (E) SASP reduces the Carboplatin IC<sub>50</sub> of most basal TNBC; paired icons connected by dashed lines represent a single TNBC; colored icons, Carboplatin IC<sub>50</sub>; gray icons, IC<sub>50</sub> of Carboplatin plus 300  $\mu$ M SASP; Q insens., basal

TNBC with less glutamine-sensitivity than non-tumorigenic cells. (F) Summary of discussed glutamine catabolic activities. Red, compounds tested in this manuscript; green, activities with potential therapeutic inhibitory importance in glutamineavid TNBC; dark blue, LAT1 glutamine/leucine antiporter and ASCT2, system ASC glutamine transporter; gray, xCT, the glutamate/cystine antiporter; light blue, glutamine anaplerosis path; SASP, Sulfasalazine; ASP, Asparaginase; DON, 6-diazo-5-oxo-Lnorleucine; ATs, various aminotransferases; GS, glutamine synthase; GLS, glutaminase; hGAC, carboxy-terminal splice variant of glutaminase. Not all uses of intracellular glutamine or DON targets are illustrated. See also Figure S7.