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RESEARCH ARTICLE

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# Methylglyoxal, a glycolysis metabolite, triggers metastasis through MEK/ERK/SMAD1 pathway activation in breast cancer

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## Abstract

**Background:** Elevated aerobic glycolysis rate is a biochemical alteration associated with malignant transformation and cancer progression. This metabolic shift unavoidably generates methylglyoxal (MG), a potent inducer of dicarbonyl stress through the formation of advanced glycation end products (AGEs). We have previously shown that the silencing of glyoxalase 1 (GLO1), the main MG detoxifying enzyme, generates endogenous dicarbonyl stress resulting in enhanced growth and metastasis in vivo. However, the molecular mechanisms through which MG stress promotes metastasis development remain to be unveiled.

**Methods:** In this study, we used RNA sequencing analysis to investigate gene-expression profiling of GLO1-depleted breast cancer cells and we validated the regulated expression of selected genes of interest by RT-qPCR. Using in vitro and in vivo assays, we demonstrated the acquisition of a pro-metastatic phenotype related to dicarbonyl stress in MDA-MB-231, MDA-MB-468 and MCF7 breast cancer cellular models. Hyperactivation of the mitogen-activated protein kinase kinase (MEK)/extracellular signal-related kinase (ERK)/SMAD and MAD proteins (SMAD)1 pathway was evidenced using western blotting upon endogenous MG stress and exogenous MG treatment conditions. MEK and SMAD1 regulation of MG pro-metastatic signature genes in breast cancer cells was demonstrated by RT-qPCR.

**Results:** High-throughput transcriptome profiling of GLO1-depleted breast cancer cells highlighted a pro-metastatic signature that establishes novel connections between MG dicarbonyl stress, extracellular matrix (ECM) remodeling by neoplastic cells and enhanced cell migration. Mechanistically, we showed that these metastasis-related processes are functionally linked to MEK/ERK/SMAD1 cascade activation in breast cancer cells. We showed that sustained MEK/ERK activation in GLO1-depleted cells notably occurred through the down-regulation of the expression of dual specificity phosphatases in MG-stressed breast cancer cells. The use of carnosine and aminoguanidine, two potent MG scavengers, reversed MG stress effects in in vitro and in vivo experimental settings.

**Conclusions:** These results uncover for the first time the key role of MG dicarbonyl stress in the induction of ECM remodeling and the activation of migratory signaling pathways, both in favor of enhanced metastatic dissemination of breast cancer cells. Importantly, the efficient inhibition of mitogen-activated protein kinase (MAPK) signaling using MG scavengers further emphasizes the need to investigate their therapeutic potential across different malignancies.

**Keywords:** Breast cancer, Methylglyoxal, SMAD1, Metastasis, Carnosine, MAPK

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## Background

A key hallmark of cancer cells is their metabolic reprogramming consisting of enhanced aerobic glycolysis over oxidative respiration. This so called “Warburg effect” leads to the accumulation of methylglyoxal (MG), a highly toxic and reactive dicarbonyl, that spontaneously glyicates proteins, nucleic acids and lipids [1]. The reaction of MG with the amino group of proteins leads to the formation of advanced glycation end-products (AGEs) such as hydroimidazolones (MG-Hs) and argpyrimidines [2]. To fight MG, mammalian cells developed a detoxifying system consisting of glyoxalases 1 and 2 (GLO1 and GLO2) that transform MG into D-lactate in the presence of reduced glutathione [3]. The imbalance between MG production and its detoxification results in MG adducts accumulation in cells identified as dicarbonyl stress. The consequences of this cellular stress have been mainly studied in the context of diabetes mellitus and its complications [4]. Collagen, laminin and mitochondrial proteins are examples of MG targets [5]. Because of their slow turnover, long-living proteins such as collagens are more prone to being glycated and cross-linked by MG [6]. Previously, we reported the consistent accumulation of MG protein adducts in patients with breast [7] and colon [8] cancers compared to their respective normal counterparts. Initially, MG was mostly considered a toxic molecule for both normal and cancer cells. Recently, using breast and glioblastoma cell lines, our group has demonstrated that low doses of MG promote tumor growth rather than inhibit it. This hormesis effect of MG seemingly reconciles contrasting data in the literature [9]. In fact, at sub-toxic doses, MG turns out to be beneficial to cancer cells as they acquire resistance to apoptosis and enhanced growth properties.

Furthermore, it remains controversial whether GLO1 in cancer acts as a tumor suppressor or oncogene. Several studies depicted GLO1 as an amplified and/or overexpressed oncogene associated with a poor prognosis in various types of malignant tumors, thus considering the inhibition of GLO1 activity as a potential anti-cancer therapy (for review [10]). Zender and collaborators [11] identified and validated GLO1 as a tumor suppressor gene in hepatocellular carcinoma and knockdown of GLO1 using short hairpin RNAs (shRNAs) increased tumor growth in vivo. In line with these data, we have recently reported that breast cancer cells stably depleted in GLO1 and, consequently, bearing a higher level of MG, exhibit significantly enhanced tumor growth and metastatic potential [12]. We have showed that MG glyicates HSP90, which leads to nuclear accumulation of Yes-associated protein (YAP) and the blockade of the Hippo tumor suppressor pathway [12]. If this mechanism has shed some light on the pro-growth effect of MG, it did not provide any clues to explain how this metabolite might enhance the metastatic phenotype of breast cancer cells. Accordingly, the

aim of the present study was to ascertain whether MG could specifically have an impact on essential processes and pathways governing migration and metastasis.

Comprehensive RNA-sequencing (RNASeq) analysis of GLO1-depleted cancer cells identified a metastatic transcriptomic signature involving genes tightly associated with cell migration and extracellular matrix (ECM) remodeling, such as collagens and tenascin C. We have demonstrated that MG-induced pro-metastatic signature is linked with the activation of the mitogen-activated protein kinase kinase (MEK)/extracellular signal-related protein kinase (ERK) pathway, which signals through activated SMAD and MAD proteins (SMAD)1. We have further demonstrated that MEK/ERK-sustained activation in GLO1-depleted cells notably occurs through the down-regulation of dual specificity phosphatase 5 (DUSP5) phosphatase expression upon MG stress in breast cancer cells. Overall, our study demonstrated for the first time that MG stress is able to change the ECM and to regulate migratory signaling pathways, both in favor of enhanced metastatic dissemination of breast cancer cells.

## Methods

### Cell culture and reagents

MDA-MB-231 and MCF7 cancer cell lines were obtained from the American Type Culture Collection (ATCC, Manassas, VA, USA). MDA-MB-468 cells were kindly provided by Dr C. Gilles (University of Liège, Belgium). Cells were cultured in Dulbecco’s modified Eagle’s medium (DMEM) (Lonza) containing 10% fetal bovine serum (FBS, ThermoFisher Scientific) and 2 mM L-glutamine (Lonza). For cell signaling analysis, cells were cultured in DMEM with L-glutamine and without FBS. L-carnosine (C9625), aminoguanidine (396494) and methylglyoxal (MG, M0252) were from Sigma. We excluded the presence of significant formaldehyde contamination (<3%) in MG (lot #BCBQ 9416V) by nuclear magnetic resonance (NMR) analysis. Transforming growth factor (TGF) $\beta$  (#10021) was from Peprotech. U0126 (S1102) was from Selleckchem. Anti-argpyrimidine antibody (mAb6B) specificity has been previously confirmed by competitive enzyme-linked immunosorbent assay (ELISA) and shown to not react with other MG-arginine adducts [13].

### Extracellular MG quantification

MG measurements were performed as previously described [12]. Briefly, culture medium was collected from GLO1-silenced MDA-MB-231 cells and the corresponding attached cells were counted to normalize MG measurements. Levels of MG were determined by derivatization with O-phenylenediamine (oPD) and analyzed by stable isotope dilution ultra-performance liquid chromatography tandem mass spectrometry (UPLC-MS/MS) as described previously [14].

### 151 **In vivo metastatic breast cancer models**

152 All animal experimental procedures were performed ac-  
153 cording to the Federation of European Laboratory Animal  
154 Sciences Associations (FELASA) and were reviewed and  
155 approved by the Institutional Animal Care and Ethics Com-  
156 mittee of the University of Liège. Animals were housed in  
157 the GIGA-accredited animal facility (University of Liège).  
158 Eight-week-old female NOD-SCID mice were inoculated  
159 via the tail vein with MDA-MB-231 shNT, shGLO1#1 and  
160 #2 cells (500000cells/200  $\mu$ l phosphate-buffered saline  
161 (PBS)) and were monitored for 6 weeks for development of  
162 metastases. Mice received intra-peritoneal (IP) injection of  
163 carnosine (100 mg/kg) three times per week from the day  
164 of the engraftment until the end of the experiment ( $n = 12$ –  
165 14 per condition). Lungs were collected and embedded in  
166 paraffin for immunohistochemical analysis (IHC).

### 167 **Immunohistochemical analysis (IHC)**

168 IHC was performed using a standard protocol as de-  
169 scribed previously [12] using the following antibodies:  
170 anti-vimentin (1:4, clone V9, Ventana Medical Systems),  
171 anti-tenascin C (1:1000, ThermoFisher Scientific) and  
172 anti-collagen VI  $\alpha$ 3 (1:200, Sigma). Positive cells were vi-  
173 sualized using a 3,3'-diaminobenzidine substrate and the  
174 sections were counterstained with hematoxylin. Tissue  
175 sections incubated without primary antibody showed no  
176 detectable immunoreactivity. Tissue was stained with  
177 hematoxylin eosin and Masson's trichrome using stand-  
178 ard protocols.

### 179 **Evaluation of IHC staining**

180 For vimentin IHC, three different whole immunolabeled  
181 tissue sections per lung were digitalized at high reso-  
182 lution (Ventana iScan HT, Ventana Medical Systems).  
183 Vimentin-positive metastatic cells were quantified by  
184 computerized counts (QuPath 0.1.2 open source soft-  
185 ware) and verified by manual counting. The number of  
186 positive cells to lung area was reported, yielding a count  
187 expressed as the number of cells per square millimeter.  
188 For tenascin C IHC and Masson's trichrome staining, a  
189 score of 0 was associated with negative staining and a  
190 score of 1 with positive staining in tumor cells.

191 **Plasmids, shRNA and small interfering RNA (siRNA)**  
192 **transfection, quantitative reverse transcription-PCR (qRT-**  
193 **PCR), western blot and immunofluorescence**  
194 Standard protocols are detailed in Additional file 1:  
195 Supplementary methods.

### 196 **Collagen retraction assay**

197 Collagen gels were made as previously described [15].  
198 Briefly, DMEM containing 10% fetal calf serum (FCS)  
199 was prepared at the appropriate concentration and at  
200 pH 8.3 to accommodate the addition of bovine skin

collagen (3 mg/ml final concentration) in HAc 0.1% and  
MDA-MB-231 (300.000 cells/gel). After polymerization  
of the collagen, the gels were detached from the walls of  
the dishes by gentle tapping and swirling. Gel diameter  
was measured at regular intervals and collagen gel areas  
were calculated.

### 207 **Migration and invasion assays**

208 MDA-MB-231 and MDA-MB-468 cells ( $2 \times 10^5$  cells)  
209 were suspended in serum-free DMEM medium (0.1%  
210 bovine serum albumin (BSA), 1% penicillin/streptomycin  
211 (pen/strep)) and seeded into the upper part of Transwell  
212 filters (pore size 8  $\mu$ m, Costar) for migration or Transwell  
213 filters precoated with Matrigel for invasion (BD Biosci-  
214 ences). The lower compartment was filled with DMEM  
215 containing 1% BSA, 1% pen/strep and 10% FBS. After 16 h  
216 or 24 h incubation at 37 °C for migration and invasion, re-  
217 spectively, migrating cells were stained with Diff-Quick  
218 (Medion Diagnostics). Inserts were scanned at  $\times 10$  magni-  
219 fication (Eclipse Ti, Nikon). The area covered by migrating/  
220 invading cells was quantified by densitometry (ImageJ).  
221 Data are expressed as relative migration/invasion ability  
222 compared to control cells.

### 223 **Extracellular flux analyzes**

224 MCF7 (15,000 cells/well) and MCF7-M (60,000 cells/  
225 well) cells were seeded in Seahorse XFp mini-plates  
226 (Agilent) and analyzed using the Seahorse glycolysis  
227 stress test according to manufacturer's recommenda-  
228 tions. Cells were first challenged with glucose (10 mM)  
229 then successively stressed with oligomycin (1  $\mu$ M) and  
230 2-deoxyglucose (50 mM). All results were normalized to  
231 protein quantification.

### 232 **Glucose uptake**

233 Cells were incubated in glucose-free medium in the pres-  
234 ence of 2-NBDG (ThermoFisher Scientific) for 30 min and  
235 further analyzed by flow cytometry (BD Biosciences). Me-  
236 dian fluorescence intensity (MFI) was calculated.

### 237 **GLO1 activity assay**

238 GLO1 activity was assessed as previously described [7].  
239 Briefly, proteins were extracted with radioimmunopreci-  
240 pitation (RIPA) buffer, quantified and mixed with a  
241 pre-incubated (15 min at 25 °C) equimolar (1 mM) mix-  
242 ture of MG and GSH (Sigma) in 50 mM sodium phos-  
243 phate buffer, pH 6.8. S-D-lactoylglutathione formation  
244 was followed spectrophotometrically by the increase in  
245 absorbance at 240 nm at 25 °C. GLO1 activity data are  
246 expressed as arbitrary units (A.U.) of enzyme per milli-  
247 gram of proteins.

## 248 Statistical analysis

249 Data from two groups were compared using the unpaired  
250 Student's *t* test with or without Welsch's correction accord-  
251 ing to homoscedasticity. Experimental data from more than  
252 two groups were compared using one-way or two-way  
253 analysis of variance (ANOVA) depending on the num-  
Q4 254 ber of grouping factors. Dunnett's test was applied for  
255 simple comparisons while Student-Newman-Keul's (one-  
256 way ANOVA) or Bonferroni's (two-way ANOVA) tests were  
257 used for multiple comparisons. In the case of discrete vari-  
258 ables (IHC scores) or non-normally distributed variables,  
259 groups were compared using Mann-Whitney's U test.  
260 Outliers were detected using whisker box plots. A bilateral  
261 *p* value <0.05 was considered statistically significant with a  
262 95% confidence interval.

## 263 Results

### 264 RNASeq analysis of GLO1-depleted MDA-MB-231 breast 265 cancer cells highlights a pro-metastatic signature

266 In an attempt to unveil the mechanisms by which MG  
267 stress enhances the metastatic potential of breast cancer  
268 cells, we performed genome-wide messenger RNA (mRNA)  
269 profiling of MDA-MB-231 GLO1-depleted cells. We first  
270 validated GLO1 depletion by western blot and the subse-  
271 quent increased MG production in stably GLO1-silenced  
F1 272 MDA-MB-231 cells (Fig. 1a and Additional file 2:  
273 Figure S1A). Using a workflow consisting of RNASeq  
274 followed by ToppFun analysis (Fig. 1b), we have identified  
275 809 and 738 genes that were significantly differentially  
276 expressed in shGLO1#1 and #2, respectively, when com-  
277 pared to control cells. ShGLO1#1 and #2 clones had con-  
278 sistent gene modulation and overall good correlation  
279 (Fig. 1c and Additional file 2: Figure S1B). Among differ-  
280 entially expressed genes, 337 genes were common to both  
281 shGLO1 clones, among which 323 genes were consistently  
282 up-regulated or down-regulated (Fig. 1d). Based on Gene  
283 Ontology analysis, differentially expressed genes were as-  
284 sociated with key steps in the metastatic cascade including  
285 cell adhesion, migration and ECM reorganization (Fig. 1e).  
286 Globally, 196 and 184 significantly modulated genes were  
287 linked to migration and adhesion processes in shGLO1#1  
288 and #2, respectively. The combination of these two sets of  
289 genes resulted in a unique dicarbonyl stress signature con-  
290 sisting of 296 genes related to the pro-metastatic behavior  
291 of breast cancer cells, with 89 differentially expressed  
292 genes common between the two shGLO1 clones (Fig. 1f).

### 293 MG-stress-related pro-metastatic signature highlights the 294 regulation of major ECM proteins by breast cancer cells

295 We validated the expression level of remarkable up-  
296 regulated and down-regulated genes known to be linked  
297 to the metastatic potential of cancer cells (Additional file 2:  
298 Table S1). Using RT-qPCR, tenascin C and CD24 mRNA  
299 levels proved to be significantly overexpressed in GLO1-

300 depleted cells (Fig. 1g). Lumican, a small leucine-rich pro-  
301 teoglycan the down-regulation of which has been associ-  
302 ated with lung invasion in different cancer types, was  
303 significantly inhibited at the mRNA level upon MG stress  
304 (Fig. 1g). In order to demonstrate that MG stress directly  
305 regulates the expression of these genes, we treated  
306 MDA-MB-231 cells with MG. Similar to GLO1 silencing,  
307 MG treatment significantly increased tenascin C and  
308 CD24 mRNA levels and decreased lumican mRNA level  
309 (Additional file 2: Figure S1C). At the protein level, tenas-  
310 cin C overexpression was evidenced in both total protein  
311 extracts and secreted proteins deposited by cultured  
312 GLO1-depleted cells (Fig. 1h) while increased CD24 cell  
313 surface expression was confirmed using fluorescence-  
314 activated cell sorting (FACS) analysis (Fig. 1i). TGFBI, an  
315 RGD-containing ECM protein that binds to collagens, was  
316 also increased in GLO1-silenced MDA-MB-231 cells  
317 (Fig. 1j). The decrease in type IV collagens (COL4A3 and  
318 COL4A4) associated with an increase in type VI collagens  
319 (COL6A1, COL6A2 and COL6A3) particularly attracted  
320 our attention (Additional file 2: Table S1). Indeed, this  
321 inverse regulation has been linked to cancer progres-  
322 sion and metastasis [16]. We validated this specific  
323 modulation of collagen gene expression in cancer cells  
324 upon GLO1 depletion at both mRNA (Fig. 2a) and protein  
325 (Fig. 2b and c) levels. To the best of our knowledge, this is  
326 the first evidence of the direct contribution of endogenous  
327 MG stress to ECM composition by breast cancer cells. F2 Q5

### 328 GLO1-depleted cancer cells show increased collagen gel 329 retraction and anchorage-independent growth

330 The well-established role of ECM remodeling in struc-  
331 turing a microenvironment favoring cancer cell pro-  
332 gression prompted us to explore the behavior of high  
333 MG stress cancer cells using the collagen gel retraction  
334 assay, an in vitro model well-suited to study cell-mediated  
335 reorganization of the ECM. Accordingly, we analyzed the  
336 capacity of GLO1-silenced MDA-MB-231 cells to com-  
337 pact collagen fibers in the presence of 10% FCS. After 6  
338 days, GLO1 deficient cells induced significantly higher  
339 collagen gel retraction than control cells (Fig. 2d and e).  
340 Anchorage-independent growth ability of breast can-  
341 cer cells correlates with their metastatic ability [17].  
342 In anchorage-independent assays, GLO1-silenced MDA-  
343 MB-231 cells formed significantly more colonies than  
344 control cells and this difference was abrogated by the nat-  
345 ural MG scavenger carnosine (Fig. 2f and Additional file 2:  
346 Figure S2).

### 347 GLO1-depleted breast cancer cells efficiently colonize the 348 lung in an experimental metastatic model in vivo and 349 inhibitory effect of carnosine

350 To test the relevance of the pro-metastatic MG stress sig-  
351 nature in vivo, we decided to use the tail vein injection

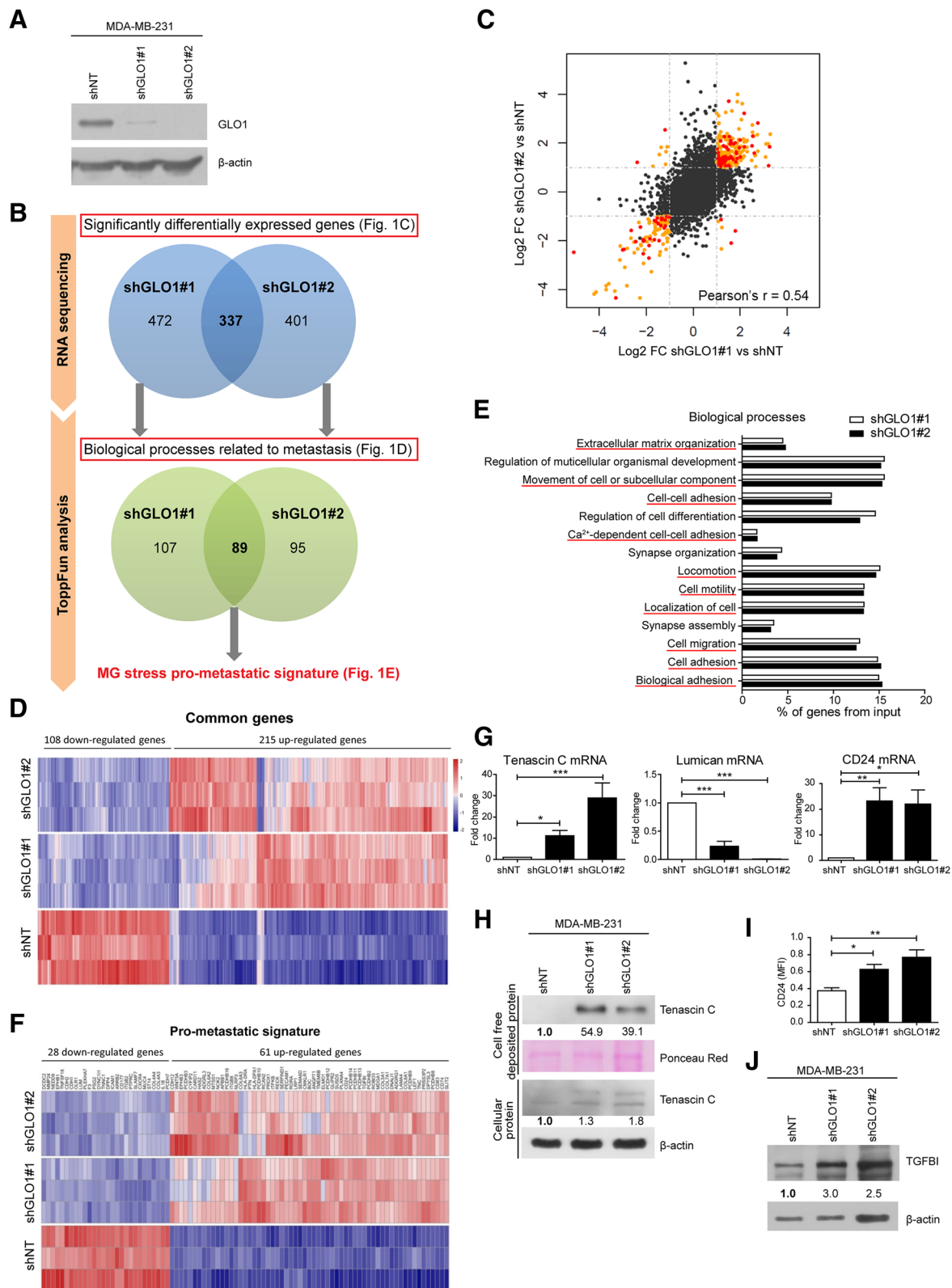


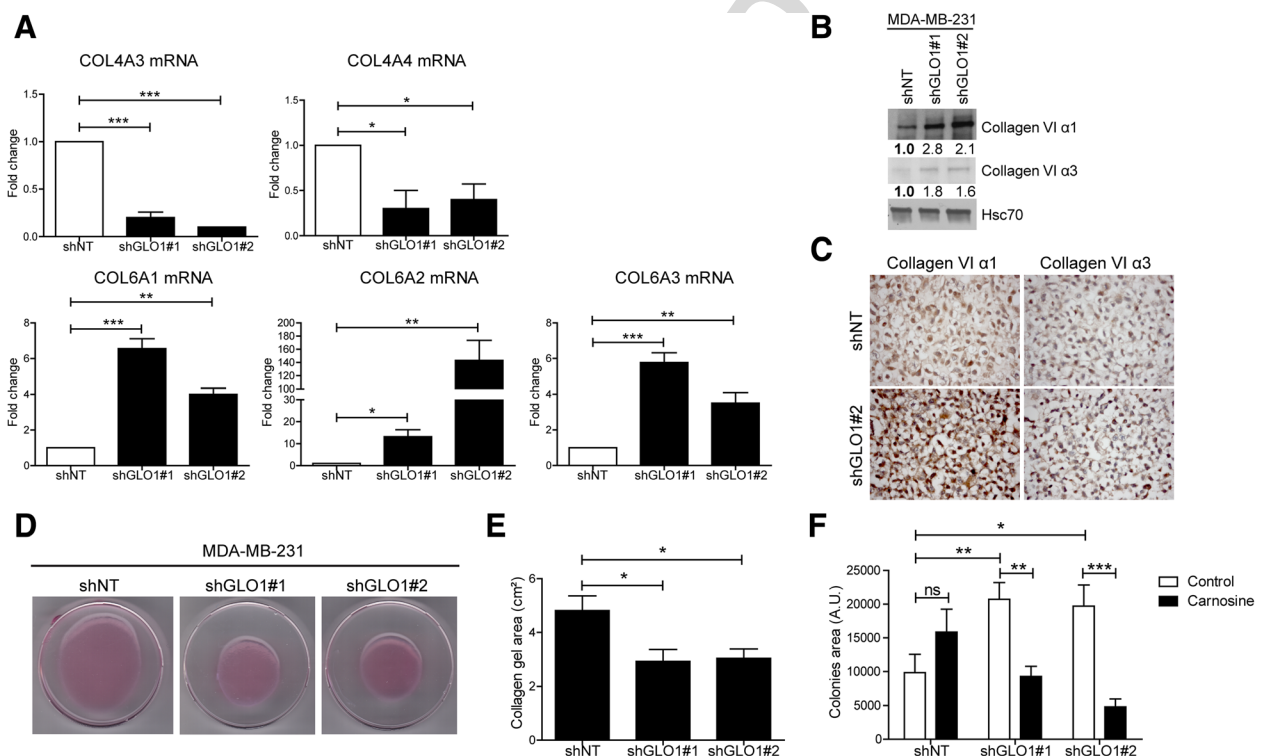
Fig. 1 (See legend on next page.)

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**Fig. 1** RNA sequencing analysis of glyoxalase 1 (GLO1)-depleted MDA-MB-231 cells highlights a pro-metastatic signature related to methylglyoxal (MG) stress. **a** GLO1 protein level in shNT, shGLO1#1 and #2 MDA-MB-231 cells.  $\beta$ -actin protein is used as loading control. Western blot is representative of three independent experiments. **b** Different steps of the high-throughput transcriptome analysis of GLO1-depleted MDA-MB-231 cells. **c** Correlation analysis of messenger RNA (Mrna) expression changes measured upon GLO1 depletion in shGLO1 (#1 and #2) clones when compared to shNT clone. Orange and red dots represent genes that are significantly differentially expressed ( $q < 0.05$  and  $\log_2$  fold change (FC) > 1). Red dots represent genes of the pro-metastatic signature. **d** Heatmap representing gene expression levels in the three replicates of all three conditions (shNT, shGLO1#1 and shGLO1#2 MDA-MB-231 cells) for genes significantly differentially expressed for both shGLO1 clones. Color scale corresponds to the expression Z-score across all samples calculated for each gene. **e** Significantly differentially expressed genes were analyzed for their gene ontology using ToppFun Suite software. Graph represents the percentage of genes from the input in the 12 most significantly affected biological processes for both shGLO1#1 and shGLO1#2 cells. Biological processes underlined in red are involved in the metastatic cascade. **f** All the genes listed in the biological processes related to metastasis were defined as the pro-metastatic gene signature of GLO1-depleted MDA-MB-231 cells. Down-regulated and up-regulated genes of the pro-metastatic gene signature are represented in a heatmap. Color scale corresponds to Z-score. **g** Tenascin C, Lumican and CD24 mRNA levels were assessed by qRT-PCR in GLO1-depleted MDA-MB-231 cells. **h** Tenascin C protein expression was detected in both cell-free deposited protein extracts and total cellular proteins of shGLO1 cells. **i** Cell surface CD24 protein level was assessed by flow cytometry. **j** TGFBI protein expression in GLO1-depleted MDA-MB-231 cells was assessed by western blot. All immunoblot data were quantified by densitometric analysis and normalized for ponceau red or  $\beta$ -actin. Numbers represent fold increase relative to the condition shown with bold number. Western blots are representative of two independent experiments. Data were analyzed using one-way analysis of variance followed by Dunnett post-hoc test and shown as mean values  $\pm$  SEM of three independent experiments. \* $p < 0.05$ , \*\* $p < 0.01$  and \*\*\* $p < 0.001$

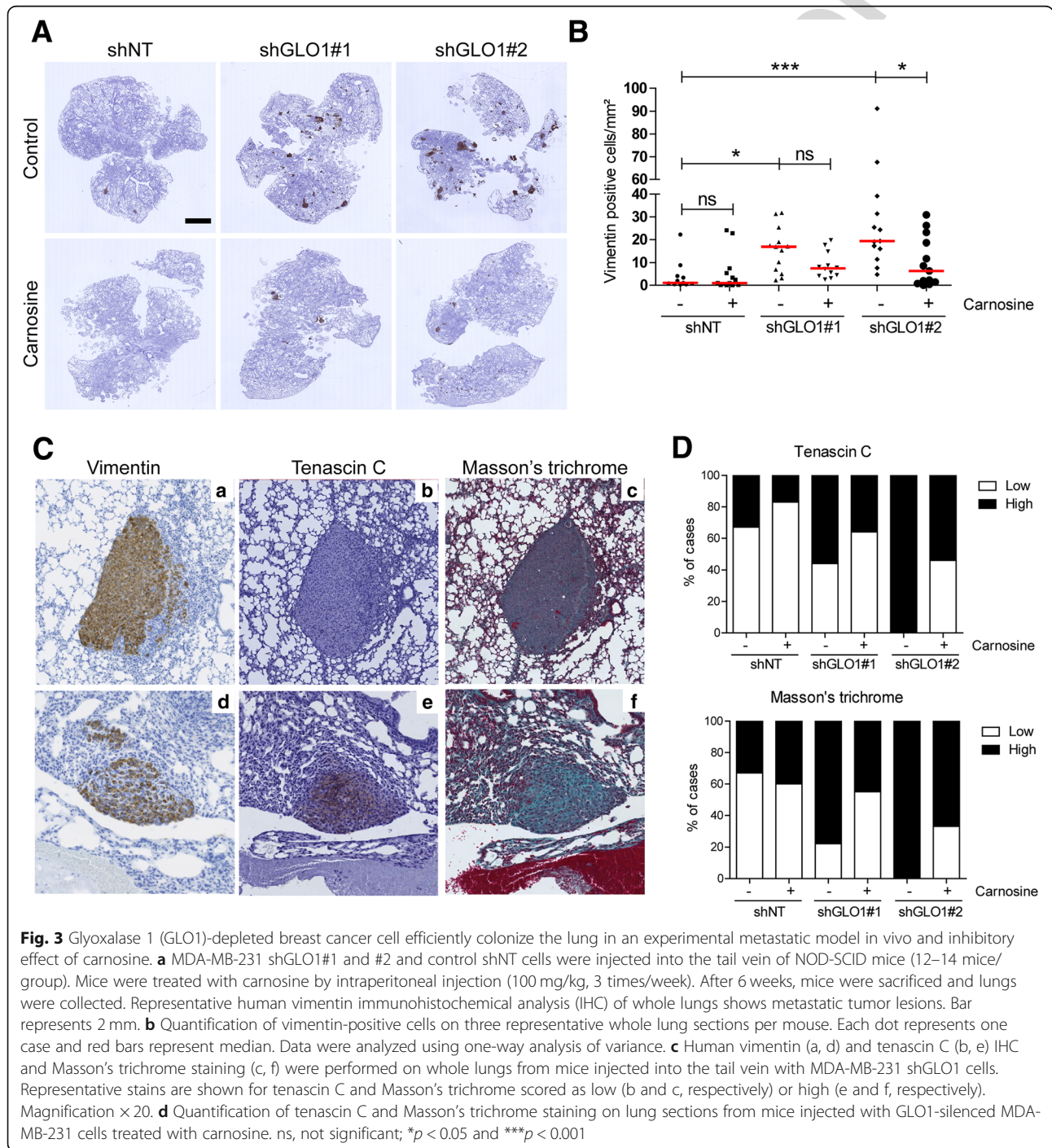


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**Fig. 2** Glyoxalase 1 (GLO1) depletion modifies the expression of extracellular matrix (ECM) proteins by breast cancer cells and promotes collagen gel retraction and anchorage-independent growth. **a** Collagen (COL4A3, COL4A4, COL6A1, COL6A2 and COL6A3 messenger RNA (mRNA) levels were assessed by qRT-PCR in GLO1-depleted MDA-MB-231 cells. Data were analyzed using one-way analysis of variance (ANOVA) followed by Dunnett post-hoc test and shown as mean values  $\pm$  SEM of three independent experiments. **b** Collagen VI  $\alpha$ 1 and  $\alpha$ 3 protein levels in MDA-MB-231 shGLO1 cells. Immunoblot data were quantified by densitometric analysis and normalized to Hsc70. Numbers represent fold increase relative to the condition shown with bold number. Western blots are representative of two independent experiments. **c** Collagen VI  $\alpha$ 1 and  $\alpha$ 3 protein levels in MDA-MB-231 shGLO1#2 and control (shNT) cells were assessed by immunohistochemical analysis (IHC). **d** Representative collagen gel retraction assays performed with MDA-MB-231 shGLO1 cells. **e** Quantification of collagen gel area after 6 days. Data were analyzed using one-way ANOVA followed by Dunnett post-hoc test and shown as mean values  $\pm$  SEM of five independent experiments. **f** Quantification of colonies formed in a soft agar matrix by GLO1-silenced MDA-MB-231 cells treated with carnosine. Data were analyzed using two-way ANOVA followed by Bonferroni post-hoc test and shown as mean values  $\pm$  SEM of three independent experiments. ns, not significant; \* $p < 0.05$ , \*\* $p < 0.01$  and \*\*\* $p < 0.001$

352 mouse model that recapitulates the major steps of the  
 353 metastatic cascade (migration/invasion, proliferation and  
 354 survival) independently from the growth of the primary  
 355 tumor. We observed that GLO1-depleted cells injected  
 356 into the tail vein of NOD-SCID mice induced a significant  
 357 increase in pulmonary tumor burden when compared  
**F3** 358 with control (Fig. 3a). In the same model, carnosine  
 359 intra-peritoneal administration significantly reduced lung  
 360 colonization thus connecting this aggressive characteristic

with MG stress (Fig. 3a and b). Finally, IHC for tenascin C  
 361 and collagen deposition assessed by Masson's trichrome  
 362 staining in metastatic lung sections showed high detectable  
 363 levels of both ECM components (Fig. 3c and d), which were  
 364 consistently lower in metastatic foci of carnosine-treated  
 365 mice (Fig. 3d). Next, we examined whether enhanced  
 366 anchorage-independence growth and metastatic potential  
 367 (i.e., lung colonization) of GLO1-depleted cells correlated  
 368 with increased invasion and migration ability in vitro.  
 369



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#### 370 **MG stress increases invasive and migratory abilities of** 371 **breast cancer cells in vitro**

372 The migratory ability of GLO1-depleted cancer cells in-  
373 creased up to 2.5-fold compared with control cells  
F4 374 (Fig. 4a and b). This increased migratory ability was reversed  
375 by overexpressing GLO1 in shGLO1#1 MDA-MB-231 cells  
376 (Additional file 2: Figure S3A and B). GLO1 rescue was  
377 evaluated by western blot (Additional file 2: Figure S3C).  
378 Additionally, the pre-treatment of GLO1-depleted cells with  
379 carnosine and aminoguanidine, MG scavengers, decreased  
380 their migration to control level (Fig. 4a and b). GLO1 deple-  
381 tion was also significantly associated with augmented inva-  
Q7 382 sive potential in vitro, which was efficiently reversed by  
383 pre-treatment with both scavengers (Additional file 2:  
384 Figure S3D and E). To exclude the possibility of this  
385 MG-induced effect being anecdotal to MDA-MB-231  
386 cells, we exploited a model of highly tumorigenic and mo-  
387 tile MCF7-M breast cancer cells, generated by prolonged  
388 mammosphere culture. In good accordance with previous  
389 reports [18, 19], MCF7-M cells exhibited a stable mesen-  
390 chymal phenotype (Fig. 4c and Additional file 2: Figure  
391 S4A), enhanced glycolysis (Fig. 4d and Additional file 2:  
392 Figure S4B) and glucose uptake (Fig. 4e). We first demon-  
393 strated that MCF7-M cells were associated with signifi-  
394 cantly higher accumulation of MG-Hs and argpyrimidine  
395 adducts than in the control parental MCF7 cells (Fig. 4f).  
396 These data are consistent with our recent demonstration  
397 that glycolytic cancer cells are more prone to control MG  
398 toxicity than less glycolytic cancer cells, notably through  
399 the expression of elevated levels of both GLO1 and its  
400 cognate transcriptional regulator Nrf2 [9]. Accordingly,  
401 MCF7-M had a high GLO1 protein level and activity and  
402 elevated Nrf2 expression when compared with MCF7 cells  
403 (Fig. 4g and h). Finally, on treatment with carnosine and  
404 aminoguanidine, the migratory capacity of MCF7-M cells  
405 significantly reverted to the level of parental cells (Fig. 4i  
406 and j), indicating the implication of MG stress in this  
Q8 407 process. These data, generated using two experimental  
408 cancer models, support the conclusion that MG dicarbo-  
409 nyl stress promotes the migration and invasion of breast  
410 cancer cells. We selected cell migration ability to be used  
411 all along the following mechanistic exploration as a func-  
412 tional readout of MG stress in breast cancer cells.

#### 413 **Both endogenous and exogenous MG stress are** 414 **associated with (hyper)activation of the MEK/ERK** 415 **signaling pathway in breast cancer cells that is linked to** 416 **their enhanced migratory potential**

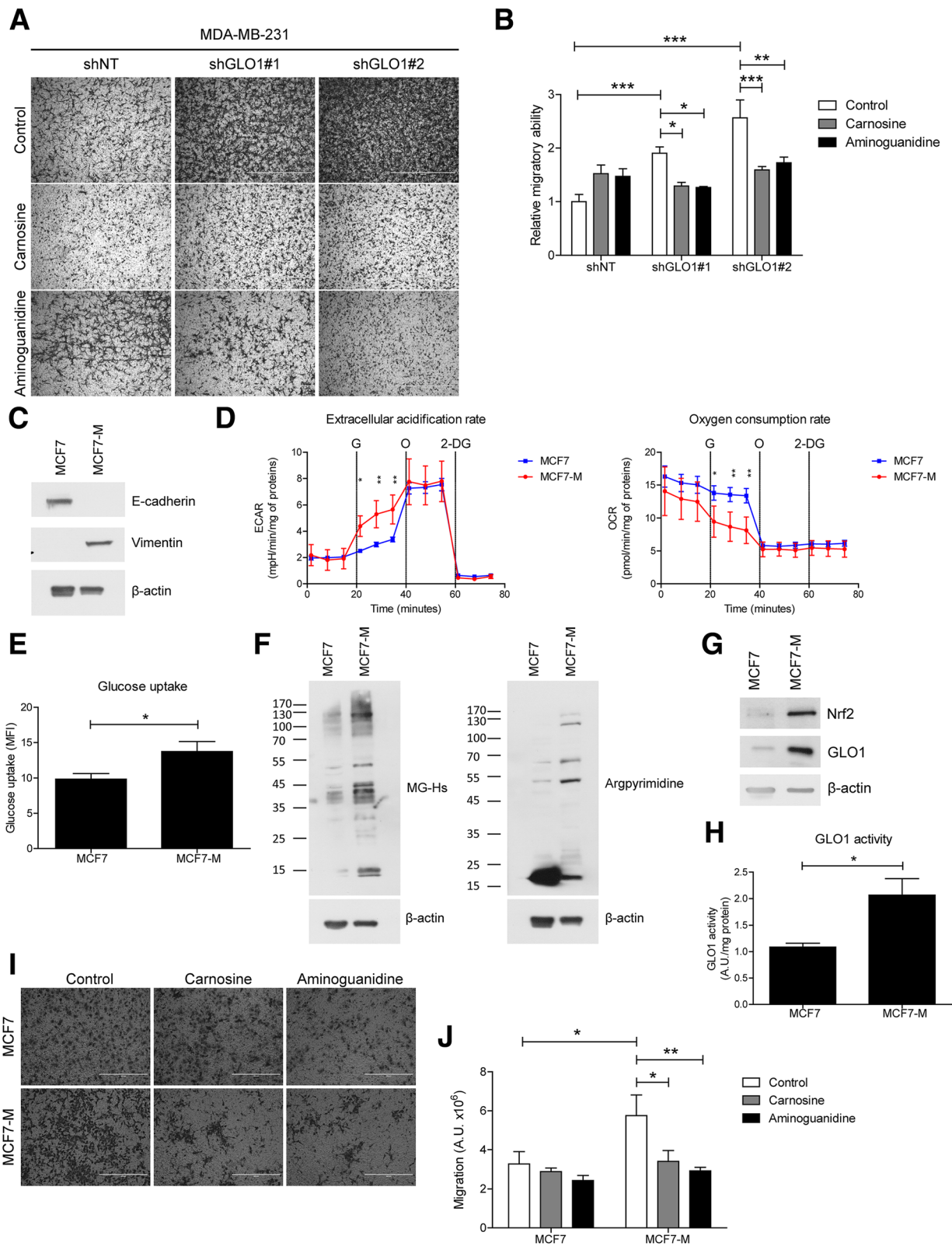
417 As a major component of the tumor microenvironment,  
418 the ECM regulates many pathways in cancer cells, includ-  
419 ing TGF- $\beta$ /bone morphogenic protein (BMP), PI3K/AKT,  
420 ERK, c-Jun N terminal kinase (JNK), Src-focal adhesion  
421 kinase (FAK) and Rho-GTPases [20]. Following the ration-  
422 ale that TGF $\beta$  is a key regulator of ECM synthesis in cancer,

we first explored the impact of MG stress on the TGF $\beta$  423  
pathway. Under basal conditions, neither GLO1-depleted 424  
nor control MDA-MB-231 cells showed detectable phos- 425  
phorylated SMAD2/3, albeit, they were responsive to TGF $\beta$  426  
as indicated by SMAD2/3 activation upon TGF $\beta$  stimulus 427  
(Fig. 5a). Interestingly, SMAD4 expression was significantly 428  
decreased in GLO1-depleted cells, suggesting that the can- 429  
onical TGF $\beta$  pathway was dispensable upon MG stress 430  
induction in these cells (Fig. 5a). 431

We therefore explored alternative signaling pathways 432  
downstream of tyrosine kinase receptors and found that 433  
the level of phosphorylated MEK and ERK was increased 434  
in GLO1-depleted MDA-MB-231 cells (Fig. 5b). Knowing 435  
that MDA-MB-231 cells are mutated for KRAS and have a 436  
constitutive basal activation of MEK/ERK signaling pathway, 437  
we postulated that GLO1 silencing might be associated with 438  
the specific hyperactivation of this pathway. To verify this 439  
hypothesis, we next attempted to recapitulate this MG effect 440  
on MEK/ERK activity in MDA-MB-468 cells, a triple- 441  
negative breast cancer cell line that is wild-type for KRAS. 442  
Interestingly, MDA-MB-468 clones stably depleted for 443  
GLO1 (Additional file 2: Figure S5A) demonstrated a signifi- 444  
cant increase in MEK/ERK activation over the basal levels of 445  
control cells (Fig. 5b). Similar to MDA-MB-231 cells, we 446  
found that CD24 and lumican, two genes from the pro- 447  
metastatic signature, were increased and decreased, 448  
respectively, in GLO1-depleted MDA-MB-468 cells 449  
(Additional file 2: Figure S5B). These changes were also re- 450  
capitulated upon MG treatment in control MDA-MB-468 451  
cells (Additional file 2: Figure S5C). We were also able to 452  
recapitulate both enhanced migratory (Additional file 2: 453  
Figure S5D and E) and anchorage-independent growth 454  
(Additional file 2: Figure S5F and G) abilities in GLO1- 455  
depleted MDA-MB-468 cells that both consistently 456  
reverted on treatment with carnosine. 457

To consolidate the existence of a link between MG stress 458  
and MEK/ERK activation, we cultured MDA-MB-231 and 459  
MDA-MB-468 cells in the presence of increasing concen- 460  
trations of exogenous MG. MG treatment induced P-MEK 461  
and P-ERK in both cell lines (Fig. 5c). Along the same line, 462  
carnosine prevented MEK/ERK activation in both shGLO1 463  
MDA-MB-231 and MDA-MB-468 cells (Fig. 5d). Based on 464  
these data, we sought to corroborate the functional rele- 465  
vance of MG-mediated MEK/ERK hyperactivation with the 466  
enhanced migratory ability of GLO1-depleted breast cancer 467  
cells. Therefore, we treated GLO1-depleted MDA-MB-231 468  
cells with U0126 MEK inhibitor. U0126 significantly pre- 469  
vented the increased migratory capacity observed for breast 470  
cancer cells under MG stress (Fig. 5e and f). Supporting 471  
this observation further, the expression of representative 472  
genes from the MG stress pro-metastatic signature, which 473  
were either induced (tenascin C, COL6A3) or repressed 474  
(lumican and COL4A3), reverted consistently in the pres- 475  
ence of U0126 at the mRNA level in MDA-MB-231 cells 476

F5



**Fig. 4** (See legend on next page.)

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f4.7 **Fig. 4** Dicarbonyl stress promotes migration and invasion of breast cancer cells. **a** Migration ability of glyoxalase 1 (GLO1)-depleted MDA-MB-231  
 f4.8 toward serum was assessed using Transwell filters. Where indicated, cells were pre-treated with the methylglyoxal (MG) scavengers, carnosine and  
 f4.9 aminoguanidine, 24 h prior to the assay. Representative filters are shown for each condition. Scale bar represents 400  $\mu$ m. **b** Quantification of  
 f4.10 migratory ability of GLO1-silenced MDA-MB-231 cells treated with carnosine and aminoguanidine. Data were analyzed using two-way analysis of  
 f4.11 variance (ANOVA) followed by Bonferroni post-hoc test and shown as mean values  $\pm$  SEM of three independent experiments. **c** E-cadherin and  
 f4.12 vimentin expression in MCF7 and MCF7-M cells.  $\beta$ -actin protein level was used as loading control. A representative western blot of two  
 f4.13 independent experiments is shown. **d** Extracellular acidification (ECAR) and oxygen consumption (OCR) rates in MCF7 and MCF7-M cells using  
 f4.14 Seahorse flux analyzer. G, O and 2-DG correspond to injection of glucose, oligomycin and 2-deoxyglucose, respectively. Data were analyzed using  
 f4.15 two-way ANOVA and are representative of two independent experiments. **e** Glucose uptake was assessed in MCF7 and MCF7-M cells using FACS  
 f4.16 analysis. Data were analyzed using Student's *t* test and are shown as mean values  $\pm$  SEM from three independent experiments. **f** MG-Hs and  
 f4.17 argpyrimidine MG adducts levels were detected by immunoblot using specific antibodies in MCF7 and MCF7-M cells, with  $\beta$ -actin as loading  
 f4.18 control. **g** GLO1 and Nrf2 expression in MCF7 and MCF7-M cells.  $\beta$ -actin protein is used as loading control. Western blot is representative of three  
 f4.19 independent experiments. **h** GLO1 maximal activity was measured in MCF7 and MCF7-M cells and expressed as arbitrary units (A.U.) per mg of  
 f4.20 proteins. Data were analyzed using Student's *t* test and are shown as mean values  $\pm$  SEM of three independent experiments. **i** Migration ability  
 f4.21 toward serum of MCF7 and MCF7-M cells was assessed using Transwell filter. Cells were pre-treated with carnosine and aminoguanidine MG  
 f4.22 scavengers for 24 h prior to the assay. Representative filters are shown for each condition. Scale bar represents 400  $\mu$ m. **j** Quantification of MCF7  
 f4.23 and MCF7-M cells migration assays. Data were analyzed using two-way ANOVA followed by Bonferroni post-hoc test and are shown as mean  
 f4.24 values  $\pm$  SEM of three independent experiments. \**p* < 0.05, \*\**p* < 0.01 and \*\*\**p* < 0.001

477 (Fig. 5g). The data gathered so far demonstrate that MG  
 478 dicarbonyl stress induces (hyper)activation of MEK/ERK  
 479 signalization, independently of KRAS status, which sustains  
 480 the regulation of pro-metastatic gene expression and migra-  
 481 tory capacity of breast cancer cells.

#### 482 (Hyper)activation of the MEK/ERK pathway leads to 483 SMAD1 phosphorylation and regulation of MG stress pro- 484 metastatic signature genes

485 To understand how (hyper)activation of the MEK/ERK  
 486 signaling cascade in GLO1-depleted breast cancer cells  
 487 relates to their metastatic potential, we first considered  
 488 that MEK/ERK signaling could be mediated by the physical  
 489 translocation of ERK in the nucleus. Using immunofluores-  
 490 cence, we excluded this possibility as GLO1-silenced cells  
 491 showed P-ERK levels that were comparable to control cells  
 492 using both MDA-MB-231 and MDA-MB-468 cells (Addi-  
 493 tional file 2: Figure S6A and B, respectively). Early studies  
 494 involving expression of epitope-tagged SMAD1 indicated  
 495 that it was generally involved in BMP, but not in TGF $\beta$  sig-  
 496 naling [21, 22]. More recent data demonstrate that acti-  
 497 vated Ras/MEK pathway could participate in SMAD1  
 498 nuclear transcriptional activity [23, 24]. Based on that, we  
 499 next evaluated SMAD1 expression and localization in  
 500 GLO1-depleted MDA-MB-231 cells. As shown in represen-  
 501 tative immunofluorescence pictures, higher SMAD1 levels  
 502 were detectable in the nucleus of GLO1-silenced MDA-  
 F6 503 MB-231 cells than in control cells (Fig. 6a). Phosphorylation  
 504 of SMAD1 occurs at serine 206 (Ser 206) and serine 463/  
 505 465 (Ser 463/465) following the activation of MAPK and  
 506 BMP pathways, respectively [25]. In GLO1-depleted  
 507 MDA-MB-231 and MDA-MB-468 cells (Fig. 6b), we evi-  
 508 denced a specific increase in P-SMAD1 (Ser 206) and a de-  
 509 crease in P-SMAD1/5 (Ser 463/465) that effectively points  
 510 to cross-talk with MAPK signaling. We observed no signifi-  
 511 cant change in SMAD1 and SMAD5 mRNA levels (Fig. 6c).

GLO1 rescue in shGLO1#1 MDA-MB-231 cells reduced 512  
 P-SMAD1 (Ser 206) (Additional file 2: Figure S7A). 513  
 Consistently, MDA-MB-231 and MDA-MB-468 cells 514  
 cultured in the presence of MG showed significant in- 515  
 duction of total SMAD1 and P-SMAD1 (Ser 206) and 516  
 decreased (Ser 463/465) (Fig. 6d). U0126 treatment fur- 517  
 ther demonstrated the link with the MEK cascade as it 518  
 strongly reduced the level of P-SMAD1 (Ser 206) in 519  
 MDA-MB-231 cells (Fig. 6e). MDA-MB-468 cells, which 520  
 are considered as high SMAD1 expressers when com- 521  
 pared with other breast cancer cell lines [26], showed a 522  
 similar pattern of SMAD1 serine phosphorylation upon 523  
 MG treatment (Fig. 6d). Metastatic MCF7-M cells, bear- 524  
 ing high endogenous MG stress, showed elevated total 525  
 and phosphorylated SMAD1 levels when compared with 526  
 parental MCF7 cells (Additional file 2: Figure S7B). 527  
 SMAD1 inhibition (Additional file 2: Figure S7E) signifi- 528  
 cantly decreased the migratory potential of MCF7-M cells 529  
 (Additional file 2: Figure S7C and D). 530

Next, we further explored this new link between SMAD1 531  
 effector activation and MG stress signature. To this end, we 532  
 evaluated the impact of GLO1 depletion on the expression 533  
 of MG stress signature genes known to be SMAD1 targets. 534  
 Seven out of 11 SMAD1 target genes, shown to be 535  
 up-regulated under shGLO1 condition in RNASeq analysis, 536  
 were significantly reduced upon SMAD1 silencing in 537  
 GLO1-depleted MDA-MB-231 (Fig. 6f). The same experi- 538  
 ment conducted on GLO1-depleted MDA-MB-468 cells re- 539  
 vealed 5 out of 11 MG stress signature genes regulated by 540  
 SMAD1, amongst which the PECAM1, GLI2 and B3GNT7 541  
 genes were common with MDA-MB-231 evaluation (Addi- 542  
 tional file 2: Figure S8A). Efficient silencing of SMAD1 was 543  
 validated at the mRNA level in MDA-MB-231 (Fig. 6f) and 544  
 in MDA-MB-468 cells (Additional file 2: Figure S8A). The 545  
 silencing of SMAD1 in both GLO1-depleted cellular 546  
 models had an impact on their migration ability and 547

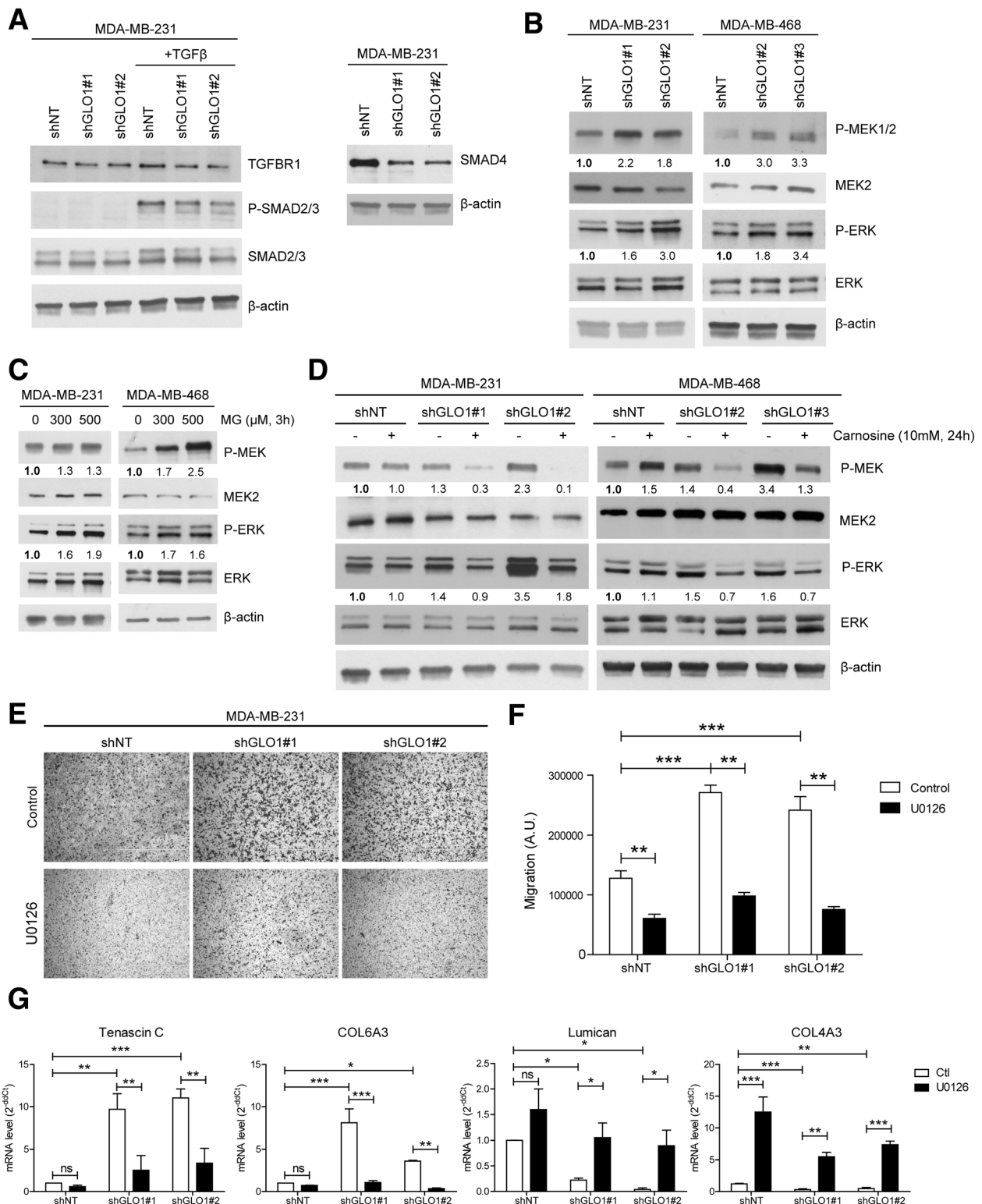


Fig. 5 (See legend on next page.)

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f5.7 **Fig. 5** Methylglyoxal (MG) stress induces (hyper)activation of the mitogen-activated protein kinase (MAPK) signaling pathway in breast cancer  
 f5.8 cells. **a** Transforming growth factor (TGF) $\beta$ R1, P-SMAD2/3 and SMAD4 protein levels in glyoxalase 1 (GLO1)-depleted MDA-MB-231 cells. Cells were  
 f5.9 treated with TGF $\beta$  2.5 ng/ml for 2 h where indicated. **b** P-MEK1/2, MEK2, P-ERK and ERK expression in GLO1-silenced MDA-MB-231 and MDA-MB-  
 f5.10 468 cells cultured without serum for 24 h. **c** P-mitogen-activated protein kinase (MEK)1/2, MEK2, P-extracellular signal-related protein kinase  
 f5.11 (ERK) and ERK protein level in MDA-MB-231 and MDA-MB-468 cells treated with MG at the indicated concentrations for 3 h in serum-free  
 f5.12 medium. **d** P-MEK1/2, MEK2, P-ERK and ERK expression in GLO1-silenced MDA-MB-231 and MDA-MB-468 cells treated with carnosine for 24 h in  
 f5.13 serum-free medium. All immunoblots were quantified by densitometric analysis and normalized for  $\beta$ -actin. Numbers represent fold increase  
 f5.14 relative to the condition shown with bold number. Western blot is representative of three independent experiments. **e** Migration ability toward  
 f5.15 serum of MDA-MB-231 shGLO1 cells pre-treated with MEK inhibitor, U0126 (10  $\mu$ M, 3 h), was assessed using Transwell filters. Representative filters  
 f5.16 are shown for each condition. Scale bar represents 400  $\mu$ m. **f** Quantification of migration assays of GLO1-silenced MDA-MB-231 cells treated with  
 f5.17 U0126. **g** Tenascin C, COL6A3, lumican and collagen (COL)4A3 messenger RNA (mRNA) levels in GLO1-depleted MDA-MB-231 cells treated with  
 f5.18 U0126 for 3 h in serum-free medium were assessed by qRT-PCR. Data were analyzed using two-way analysis of variance followed by Bonferroni  
 f5.19 post-hoc test and are shown as mean values  $\pm$  SEM of three independent experiments. \* $p$  < 0.05, \*\* $p$  < 0.01 and \*\*\* $p$  < 0.001  
 f5.22

548 brought it back to control cell levels (Fig. 6g and h and  
 549 Additional file 2: Figure S8B and C), as shown above for  
 550 MCF7-M cells (Additional file 2: Figure S7B and C). Effi-  
 551 cient silencing of SMAD1 was validated at the protein level  
 552 (Fig. 6i and Additional file 2: Figure S8D). These results in-  
 553 dicated that MG dicarbonyl stress induced the MEK/ERK/  
 554 SMAD1 cascade (hyper)activation that controls the expres-  
 555 sion of pro-metastatic genes and impacts on migration in  
 556 breast cancer cells.

#### 557 **MG stress is associated with a global decrease in** 558 **phosphatase gene expression in breast cancer cells**

559 Levels of ERK phosphorylation are dictated by the coordi-  
 560 nated activity of protein kinases and phosphatases  
 561 [27]. The (hyper)activation of MEK/ERK evidenced in  
 562 breast cancer cells under MG stress led us to test the  
 563 possibility that this persistent stimulation may be due to  
 564 a defect in MAPK phosphatase expression in these cells.  
 565 RNASeq data indeed showed decreased expression of  
 566 dual-specificity (DUSPs) and phosphoprotein (PPP) phos-  
 567 phatase genes in GLO1-depleted cells (Additional file 2:  
 568 Table S2). We quantified the mRNA levels of nine  
 569 PPPs (either catalytic, structural or regulatory subunits)  
 F7 570 (Additional file 2: Figure S9A) and seven DUSPs (Fig. 7a  
 571 and Additional file 2: Figure S9B) in MDA-MB-231 and  
 572 MDA-MB-468 cells. DUSPs control the duration and  
 573 magnitude of MAPK signaling activities. We selected  
 574 DUSP1, 5, 8 and 16 for further validation because of their  
 575 consistent down-regulation in MDA-MB-231 (Fig. 7a) and  
 576 MDA-MB-468 cells (Additional file 2: Figure S9B) upon  
 577 silencing with 2 GLO1 shRNAs. We validated the down-  
 578 regulation of DUSP5 and 8 at the protein level in both cell  
 579 lines (Fig. 7b). Following this, we focused on DUSP5 loss  
 580 because of its known specificity for ERK1/2 and its signifi-  
 581 cant decrease upon MG treatment at the mRNA and pro-  
 582 tein levels (Fig. 7c and d, respectively) in MDA-MB-231  
 583 and MDA-MB-468 cells. To gain insights into this new as-  
 584 sociation between DUSP5 down-regulation and MG  
 585 stress, we overexpressed DUSP5 in GLO1-depleted MDA-  
 586 MB-231 and MDA-MB-468 cells. Under these conditions,

587 we observed a significant P-ERK decrease associated with 587  
 588 reduced SMAD1 and P-SMAD1 expression in MDA- 588  
 589 MB-231 (Fig. 7e) and MDA-MB-468 cells (Fig. 7f). Upon 589  
 590 DUSP5 overexpression, both GLO1-depleted cells 590  
 591 showed a decreased migratory capacity (Fig. 7g and h 591  
 592 and Additional file 2: Figure S10A and B) thus func- 592  
 593 tionally linking DUSP5 regulation occurring under MG 593  
 594 stress with pro-metastatic features in breast cancer 594  
 595 cells. Everything included, we have then demonstrated 595  
 596 that MG dicarbonyl stress endows breast cancer cells 596  
 597 with genetic changes, notably affecting (i) ECM matrix 597  
 598 reorganization, (ii) MEK/ERK cascade via cross-talk with 598  
 599 SMAD1 transcriptional activity and (iii) DUSPs inhibition, 599  
 600 which ultimately promoted their migratory and metastatic 600  
 601 potential (Fig. 7i).

#### 602 **Discussion**

603 MG dicarbonyl stress has recently been associated with 603  
 604 the aggressiveness of various malignancies including colon 604  
 605 and breast carcinoma. However, the molecular mecha- 605  
 606 nisms underlying these effects have not been clarified so 606  
 607 far, particularly regarding MG-driven metastatic pheno- 607  
 608 type acquisition. Thanks to a comprehensive transcrip- 608  
 609 tomic approach we identified a pro-metastatic signature 609  
 610 associated with the MG stress condition, which notably 610  
 611 comprised genes associated with ECM remodeling, and 611  
 612 migration, two traits that are essential for metastasis.

613 Stromal cells are generally considered the main contribu- 613  
 614 tors to tumor ECM deposition and remodeling that favor 614  
 615 tumor growth and invasion. In this study, we showed for 615  
 616 the first time that cancer cells under MG stress directly 616  
 617 contribute to major ECM changes. Differentially expressed 617  
 618 genes in GLO1-depleted cells include several ECM compo- 618  
 619 nents such as collagens, tenascin C and lumican. On the 619  
 620 one hand, this finding corroborates recent studies implicat- 620  
 621 ing tumor cells in the expression of ECM components (i.e., 621  
 622 collagens and fibronectin) that fulfill pro-tumoral and 622  
 623 pro-metastatic functions at both primary and metastatic 623  
 624 sites. On the other hand, an interesting parallel can be 624  
 625 drawn with diabetes mellitus, where hyperglycemia results

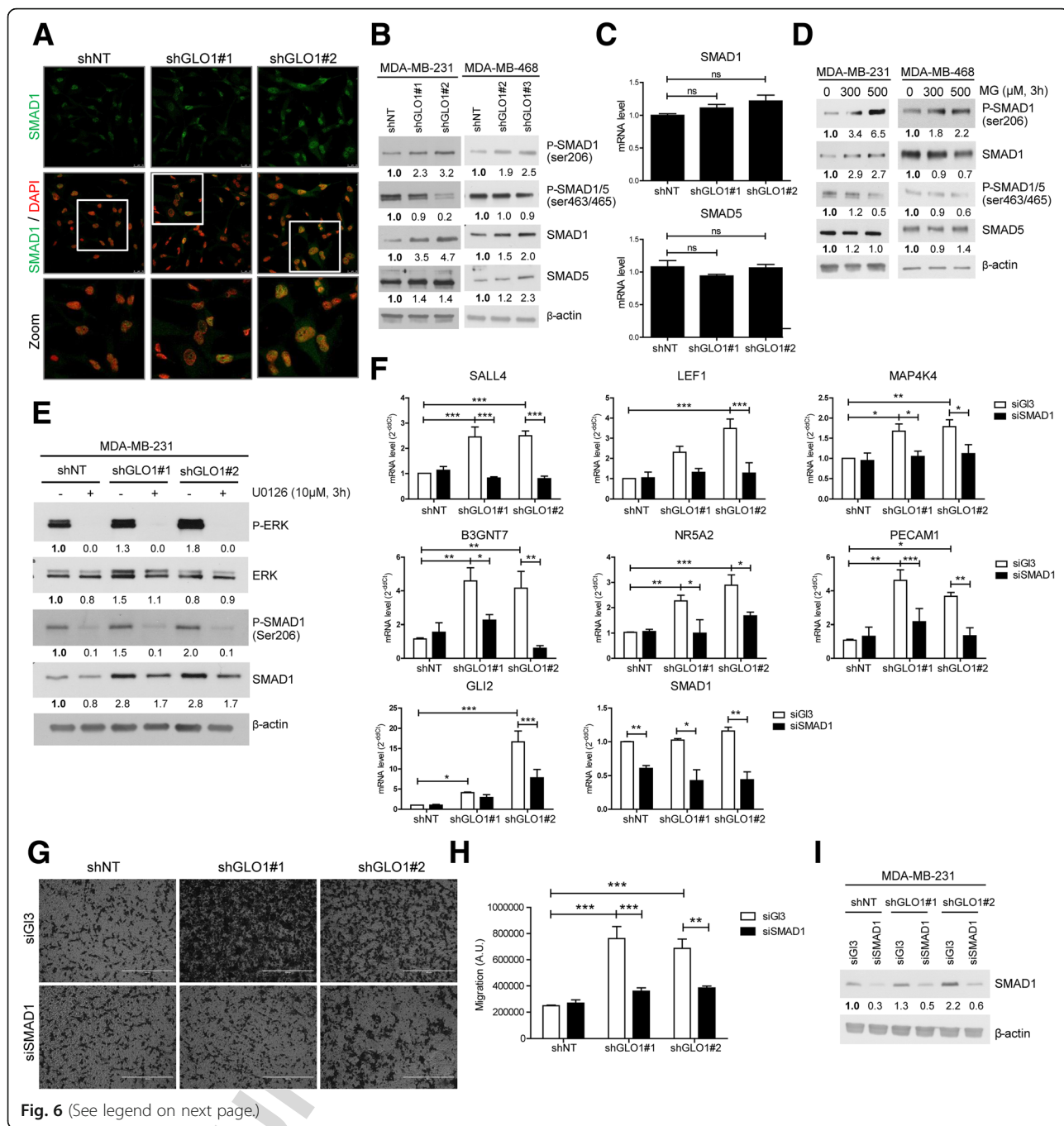


Fig. 6 (See legend on next page.)

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f6.7 **Fig. 6** (Hyper)activation of mitogen-activated protein kinase kinase (MEK) signaling leads to SMAD1 phosphorylation and regulation of  
 f6.8 methylglyoxal (MG) stress pro-metastatic signature genes in breast cancer cells. **a** SMAD1 immunofluorescence staining in glyoxalase 1 (GLO1)-  
 f6.9 silenced MDA-MB-231 cells cultured in serum-free conditions. Data are representative of three independent experiments. Magnification  $\times 630$ .  
 f6.10 Zoomed pictures (white square) are shown where indicated. **b** P-SMAD1 (ser206), P-SMAD1/5 (ser463/465), SMAD1 and SMAD5 protein levels in  
 f6.11 GLO1-silenced MDA-MB-231 and MDA-MB-468 cells cultured without serum for 24 h. **c** SMAD1 and SMAD5 mRNA levels in GLO1-depleted MDA-  
 f6.12 MB-231 cells were assessed by qRT-PCR. Data were analyzed using one-way analysis of variance (ANOVA) followed by Dunnett post-hoc test and  
 f6.13 shown as mean values  $\pm$  SEM of three independent experiments. **d** P-SMAD1 (ser206), P-SMAD1/5 (ser463/465), SMAD1 and SMAD5 protein level  
 f6.14 in GLO1-silenced MDA-MB-231 and MDA-MB-468 cells treated with MG at the indicated concentrations for 3 h in serum-free medium. **e** (P-)ERK  
 f6.15 and (P-)SMAD1 (ser206) protein level in GLO1-silenced MDA-MB-231 cells treated with U0126 MEK inhibitor (10  $\mu$ M, 3 h) in serum-free medium. **f**  
 f6.16 SMAD1 target genes mRNA levels were assessed using qRT-PCR in SMAD1-silenced MDA-MB-231 shGLO1 cells. SMAD1 mRNA level was assessed  
 f6.17 to validate efficient SMAD1 siRNA silencing. **g** Migration ability toward serum of SMAD1-silenced MDA-MB-231 shGLO1 cells was assessed using  
 f6.18 Transwell filters. Representative filters are shown for each condition. Scale bar represents 400  $\mu$ m. **h** Quantification of migration assays of SMAD1-  
 f6.19 silenced MDA-MB-231 shGLO1 cells. **i** SMAD1 protein level assessed by immunoblot to validate SMAD1-silencing using siRNAs in GLO1-depleted  
 f6.20 MDA-MB-231 cells (related to panels **g** and **h**). Immunoblot data were quantified by densitometric analysis and normalized for  $\beta$ -actin. Numbers  
 f6.21 represent fold increase relative to the condition shown with bold number. All western blots are representative of three independent  
 f6.22 experiments. Data were analyzed using two-way ANOVA followed by Bonferroni post-hoc test and shown as mean values  $\pm$  SEM of three independent  
 f6.23 experiments. \* $p < 0.05$ , \*\* $p < 0.01$  and \*\*\* $p < 0.001$   
 f6.26

626 in the accumulation of MG and its protein adducts. In fact,  
 627 GLO1-depleted myoblasts grown under a hyperglycemic  
 628 condition display MG-induced elevated expression of  
 629 collagens and increased fibrosis [28]. Elevated amounts  
 630 of collagens secreted by MG-stressed tumor cells could  
 631 be cross-linked by MG and thus generate specific  
 632 mechanotransduction signals on tumor cells to favor  
 633 their acquisition of a pro-invasive and pro-metastatic  
 634 phenotype. In good accordance with this hypothesis,  
 635 GLO1-depleted cancer cells show augmented ECM  
 636 reorganization, anchorage-independent growth and in-  
 637 creased migration/invasion ability; all inhibited in the  
 638 presence of MG scavengers. Next to collagens, tenascin C  
 639 is another remarkable cancer cell-derived ECM compo-  
 640 nent overexpressed upon MG stress. Tenascin C induces  
 641 epithelial-to-mesenchymal transition (EMT) changes in  
 642 breast cancer cells [29] and promotes their survival and  
 643 outgrowth at secondary organs, such as the lung [30]. An  
 644 example consistent with the acquisition of an invasive  
 645 phenotype upon MG stress is the up-regulation of CD24,  
 646 a mucin-like adhesion molecule that enhances the meta-  
 647 static potential of malignant cells and is shown to be a  
 648 marker of poor prognosis in breast carcinomas [31]. It is  
 649 noteworthy that MG-stress-driven fine-tuning of the ECM  
 650 consisted of the up-regulation of pro-metastatic genes but  
 651 also the down-regulation of specific components such as  
 652 lumican the reduced expression of which has been associ-  
 653 ated with poor prognosis in patients with breast cancer  
 654 [32]. Further studies will help us better understand the  
 655 role of MG in pro-tumoral ECM remodeling through a  
 656 direct effect on cancer cells but also on surrounding cells  
 657 such as fibroblasts and endothelial cells.

658 Several pro-tumorigenic signaling pathways that are  
 659 activated by ECM stiffness promote aerobic glycolysis  
 660 [33]. Emerging evidence indicates that metabolic altera-  
 661 tions and an abnormal ECM cooperatively drive cancer

cell aggressiveness and treatment resistance [20, 33]. In  
 this study, we connected MEK/ERK/SMAD1 signaling  
 activation and ECM remodeling with the major and  
 underestimated consequence of the glycolytic switch -  
 MG stress. We propose that MG stress could be sus-  
 tained through a positive regulatory loop induced by  
 ECM quantitative and qualitative changes. In this study,  
 MCF7-M cells that had undergone EMT transition and  
 glycolytic switch had accumulation of MG adducts,  
 GLO1 and NRF2 overexpression and a higher migratory  
 capacity than parental cells, this latter being reversed  
 using MG scavengers.

SMAD4 is a common transcriptional partner for acti-  
 vated SMADs, the loss of which predicts liver metastasis  
 in colon cancer [34] and bad prognosis in patients with  
 breast cancer [35]. We showed that upon dicarbonyl  
 stress, breast cancer cells had a significant decrease in  
 SMAD4 and had enhanced migratory capacity. Our pre-  
 vious data [12] and this study suggest that MG stress  
 mimics TGF $\beta$  control in ECM remodeling and the EMT  
 process. Consistent with the hypothesis of a similarity  
 between the pro-tumor effects of TGF $\beta$  and MG stress  
 is the loss of SMAD4, which has been shown to abolish  
 TGF $\beta$  tumor-suppressive functions while maintaining its  
 role as an EMT inducer [36]. Massagué's group originally  
 reported that BMP and ERK signaling inactivate SMAD1  
 through the phosphorylation of specific serine residues  
 [25]. This mechanism has notably been invoked to explain  
 how oncogenic RAS could override TGF $\beta$  tumor suppres-  
 sive effects [37]. In other studies, RAS-ERK signals en-  
 hanced the transcriptional activity of SMAD1 in response  
 to BMPs [38]. Mechanistically, we provided evidence that  
 MG stress induces sustained activation of the MEK/ERK  
 pathway that signals through SMAD1 independently of  
 KRAS mutation status. Accordingly, either the inhibition  
 of MEK or SMAD1 impacts on the expression of MG

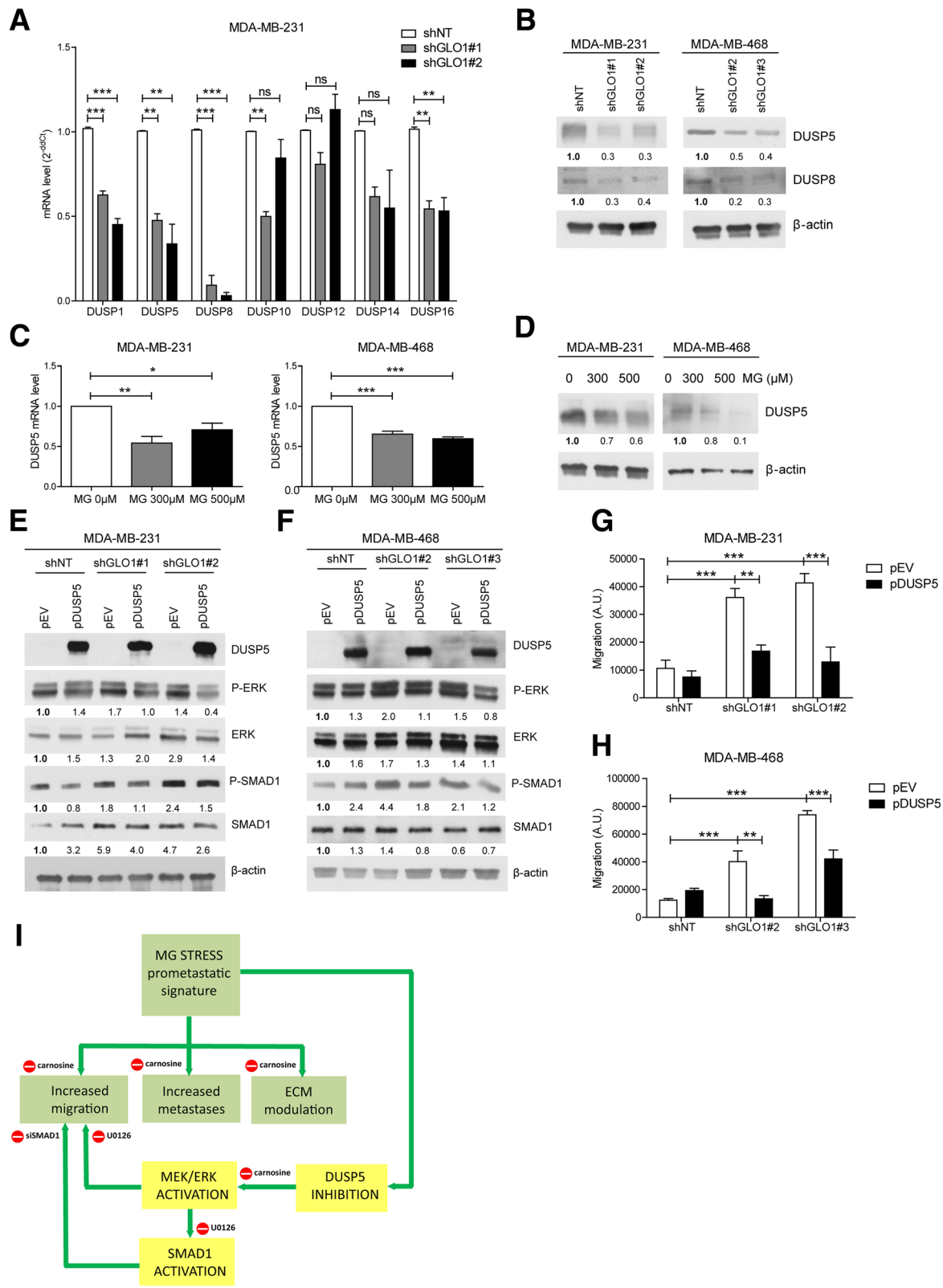


Fig. 7 (See legend on next page.)

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f7.7 **Fig. 7** Methylglyoxal (MG)-related invasive phenotype is associated with a decrease in DUSP5 phosphatase expression in breast cancer cells. **a**  
 f7.8 Dual specificity phosphate (DUSP)1, 5, 8, 10, 12, 14 and 16 phosphatase messenger RNA (Mrna) levels in glyoxalase 1 (GLO1)-depleted MDA-MB-231  
 f7.9 cells were quantified by qRT-PCR. **b** DUSP5 and DUSP8 protein expression in MDA-MB-231 and MDA-MB-468 shGLO1 cells cultured in serum-free  
 f7.10 medium for 24 h was assessed using immunoblot. DUSP5 mRNA (**c**) and protein (**d**) levels in MDA-MB-231 and MDA-MB-468 cells, respectively, treated  
 f7.11 with MG at the indicated concentrations for 3 h in serum-free medium. **e** and **f** DUSP5, (P)-extracellular signal-related protein kinase (ERK)  
 f7.12 and (P)-SMAD1 (ser206) protein levels were assessed using immunoblot in GLO1-silenced MDA-MB-231 and MDA-MB-468 cells upon DUSP5  
 f7.13 overexpression, respectively. Immunoblots were quantified by densitometric analysis and normalized for  $\beta$ -actin. Numbers represent fold increase  
 f7.14 relative to the condition shown with bold number. All western blots are representative of three independent experiments. **g, h** Quantification of  
 f7.15 migration assays of MDA-MB-231 and MDA-MB-468 shGLO1 cells upon DUSP5 overexpression, respectively. Data were analyzed using one-way  
 f7.16 analysis of variance (ANOVA) followed by Dunnett post-hoc test or two-way ANOVA followed by Bonferroni post-hoc test and are shown as mean  
 f7.17 values  $\pm$  SEM of three independent experiments. ns, not significant; \* $p < 0.05$ , \*\* $p < 0.01$  and \*\*\* $p < 0.001$ . **i** Key biological processes (green boxes) and  
 f7.18 regulatory pathways (yellow boxes) by which MG stress contributes to the metastatic phenotype. For the sake of clarity, the regulation of genes of the  
 f7.19 pro-metastatic signature exerted through the inhibition of ERK/mitogen-activated protein kinase kinase (MEK) pathway (U0126 inhibitor) and SMAD1  
 f7.20 (siSMAD1) is not represented (please see "Results" section for details)  
 f7.23

698 stress pro-metastatic signature and decreases the migra-  
 699 tory potential of breast cancer cells. We further pointed  
 700 out for the first time that MG significantly impacts on  
 701 MAPK-mediated response to stress through the inhibition  
 702 of DUSP catalytic activity in breast cancer cells.

703 The role of GLO1 in cancer progression remains con-  
 704 troversial. In this study, GLO1 silencing favored a pro-  
 705 migratory and metastatic phenotype, suggesting a tumor-  
 706 suppressing role of GLO1. A recent study published by  
 707 Guo and colleagues reported that inhibition of GLO1 pro-  
 708 moted apoptosis and decreased invasion of MDA-MB-231  
 709 cells [39]. These seemingly contradictory results both  
 710 point to the importance of determining the MG concen-  
 711 trations achieved when using the GLO1 silencing strategy.  
 712 Indeed, we recently demonstrated that MG exerts an hor-  
 713 metic effect on cancer cells that is defined by low-dose  
 714 stimulation and high-dose inhibition of tumor growth [9].

715 The significant anti-metastatic effect of carnosine desig-  
 716 nates MG stress as a promising target for therapeutic inter-  
 717 vention in aggressive tumor cells that have undergone  
 718 energy metabolic switch. To date, inhibitors of glycolysis  
 719 have had only modest therapeutic efficacy in cancer. These  
 720 unsatisfactory results may be related to the large het-  
 721 erogeneity reported for several glycolytic enzymes, as a  
 722 consequence of different genes, splice forms and post-  
 723 translational modifications. These latter make cancer cells  
 724 react differently when challenged with anti-glycolytic agents  
 725 [40]. Based on our results, we postulate that the use of MG  
 726 scavengers to prevent the formation of protein and DNA  
 727 adducts might be a more adaptive strategy to target highly  
 728 glycolytic tumors. Importantly, carnosine reversed the acti-  
 729 vation of MEK/ERK MAPK signalization, thus further  
 730 highlighting the therapeutic potential of MG scavengers  
 731 across different malignancies. Despite the recent recogni-  
 732 tion of MG as an oncometabolite [41], contemplating the  
 733 targeting of dicarbonyl stress as a promising strategy for  
 734 cancer prevention and/or therapy is still in its early days  
 735 and merits further studies.

## Conclusions

The main results of this study further emphasize the rele-  
 vance of MG stress in the acquisition of a metastatic pheno-  
 type by breast cancer cells. Our data point to direct ECM  
 remodeling by breast cancer cells and sustained activation of  
 MAPK signaling as key molecular events underlying MG  
 stress. This study improves our understanding of the con-  
 nection between glycolytic switch and breast cancer aggres-  
 siveness and proposes MG scavenger molecules (such as  
 carnosine and aminoguanidine) as potential novel treatment  
 options in the management of metastatic breast cancer.

## Additional files

**Additional file 1:** RNA sequencing, shRNA transfection, siRNA  
 transfection. Plasmids transfection. Immunofluorescence. RNA isolation  
 and quantitative reverse transcription-PCR (qRT-PCR). Western blot. Flow  
 cytometry analysis. Soft agar colony formation assays. (PDF 560 kb)

**Additional file 2: Figure S1.** RNA sequencing analysis of GLO1-  
 depleted MDA-MB-231 cells. (A) MG extracellular concentrations were  
 assessed over 48 h in conditioned medium of GLO1-depleted MDA-MB-  
 231 cells using UPLC-MS/MS. (B) Volcano plots highlighting differentially  
 expressed genes in shGLO1#1 and shGLO1#2 MDA-MB-231 cells. Orange  
 and red dots represent genes differentially expressed significantly ( $q < 0.05$  and  
 $\log_2$  fold change (FC)  $> 1$ ) for shGLO1 clones. Red dots represent genes of the  
 pro-metastatic signature. (C) Tenascin C, Lumican and CD24 mRNA levels were  
 assessed by qRT-PCR in MDA-MB-231 cells treated with MG 300 and 500  $\mu$ M for  
 1 h. Data were analyzed using one-way ANOVA followed by Dunnett post-hoc  
 test and shown as mean values  $\pm$  SEM of three independent experiments.  
 \* $p < 0.05$ , \*\* $p < 0.01$  and \*\*\* $p < 0.001$ . **Figure S2.** Dicarbonyl stress promotes  
 anchorage-independent growth and invasion of breast cancer cells.  
 Representative pictures of the colonies formed in a soft agar matrix by  
 GLO1-silenced MDA-MB-231 cells treated with carnosine. **Figure S3.**  
 Dicarbonyl stress promotes invasion of breast cancer cells. (A) Migration  
 ability toward serum of GLO1-overexpressing shNT and shGLO1#1  
 MDA-MB-231 cells was assessed using Transwell filters. Representative  
 filters are shown for each condition. (B) Quantification of migration as-  
 says of MDA-MB-231 shGLO1 cells upon GLO1 overexpression. (C) GLO1  
 protein level was assessed using immunoblot in GLO1-silenced MDA-  
 MB-231 upon GLO1 overexpression.  $\beta$ -actin protein is used as loading  
 control. Western blot is representative of three independent experiments.  
 (D) Invasiveness ability of GLO1-depleted MDA-MB-231 toward serum was  
 assessed using Transwell filters. Where indicated, cells were pre-treated with  
 MG scavengers, carnosine and aminoguanidine, 24 h prior to the assay.

Q11

780 Representative filters are shown for each condition. Scale bar represents  
 781 400  $\mu\text{m}$ . (E) Quantification of invasiveness ability of GLO1-silenced MDA-  
 782 MB-231 cells treated with carnosine and aminoguanidine. Data were  
 783 analyzed using two-way ANOVA followed by Bonferroni post-hoc test  
 784 and shown as mean values  $\pm$  SEM of three independent experiments.  
 785 ns, not significant; \* $p < 0.05$ , \*\* $p < 0.01$  and \*\*\* $p < 0.001$ . **Figure S4.**  
 786 Highly migratory MCF7 cells (MCF7-M) display enhanced aerobic glycolysis. (A)  
 787 Representative pictures of cultured MCF7 and MCF7-M cells. Scale bar repre-  
 788 sents 400  $\mu\text{m}$ . (B) Extracellular acidification rates (ECAR) in MCF7 and MCF7-M  
 789 cells using Seahorse flux analyzer. Glycolytic-related ECAR was calculated. Data  
 790 were analyzed using Student's  $t$  test and shown as mean values  $\pm$  SEM of two  
 791 independent experiments. \*\* $p < 0.01$ . **Figure S5.** Dicarboxyl stress promotes  
 792 migration and anchorage-independent growth of MDA-MB-468 breast cancer  
 793 cells. (A) GLO1 protein level in MDA-MB-468 shNT control and shGLO1#2 and  
 794 #3 cells.  $\beta$ -actin protein is used as loading control. Western blot is representa-  
 795 tive of three independent experiments. (B) Lumican and CD24 mRNA levels  
 796 were assessed by qRT-PCR in GLO1-depleted MDA-MB-468 cells. (C) Lumican  
 797 and CD24 mRNA levels were assessed by qRT-PCR in MDA-MB-468 cells  
 798 treated with MG 300 and 500  $\mu\text{M}$  for 1 h. Data were analyzed using one-way  
 799 ANOVA followed by Dunnett post-hoc test and shown as mean values  $\pm$  SEM  
 800 of three independent experiments. \* $p < 0.05$ , \*\* $p < 0.01$  and \*\*\* $p < 0.001$ . (D)  
 801 Migration ability of GLO1-depleted MDA-MB-468 toward serum was assessed  
 802 using Transwell filters. Where indicated, cells were pre-treated with carnosine  
 803 24 h prior to the assay. Representative filters are shown for each condition.  
 804 Scale bar represents 400  $\mu\text{m}$ . (E) Quantification of migratory ability of GLO1-  
 805 silenced MDA-MB-468 cells treated with carnosine. Data were analyzed using  
 806 two-way ANOVA followed by Bonferroni post-hoc test and shown as mean  
 807 values  $\pm$  SEM of three independent experiments. (F) Representative pictures of  
 808 the colonies formed in a soft agar matrix by GLO1-silenced MDA-MB-468 cells  
 809 treated with carnosine. (G) Quantification of colonies formed in a soft agar  
 810 matrix by GLO1-silenced MDA-MB-468 cells treated with carnosine. Data were  
 811 analyzed using two-way ANOVA followed by Bonferroni post-hoc test and  
 812 shown as mean values  $\pm$  SEM of three independent experiments. \* $p < 0.05$ ,  
 813 \*\* $p < 0.01$  and \*\*\* $p < 0.001$ . **Figure S6.** P-ERK localization in GLO1-depleted  
 814 breast cancer cells. P-ERK immunofluorescence staining in GLO1-silenced  
 815 MDA-MB-231 (A) and MDA-MB-468 (B) cells cultured in serum-free conditions.  
 816 Data are representative of three independent experiments. Magnification  $\times$   
 817 630. Zoomed pictures (white square) are shown where indicated. **Figure S7.**  
 818 GLO1 rescue impairs increased SMAD1 phosphorylation in GLO1-depleted  
 819 MDA-MB-231 cells and SMAD1 activation favors the enhanced migration  
 820 ability of MCF7-M cells. (A) (P-)SMAD1 (ser206) protein levels were assessed  
 821 using immunoblot in shNT and shGLO1#1 MDA-MB-231 cells upon GLO1  
 822 overexpression. (B) P-SMAD1 (ser206) and SMAD1 protein level in MCF7 and  
 823 MCF7-M cells cultured in serum-free conditions. (C) Migration ability toward  
 824 serum of SMAD1-silenced MCF7 and MCF7-M cells was assessed using  
 825 Transwell filters. Representative filters are shown for each condition. Scale bar  
 826 represents 400  $\mu\text{m}$ . (D) Quantification of migration assays of SMAD1-silenced  
 827 MCF7 and MCF7-M cells. (E) SMAD1 protein level assessed by immunoblot to  
 828 validate SMAD1-silencing using siRNAs in MCF7 and MCF7-M cells (related to  
 829 panels B and C).  $\beta$ -actin or HSC70 were used as loading control. Immunoblots  
 830 were quantified by densitometric analysis and normalized for  $\beta$ -actin. Numbers  
 831 represent fold increase relative to the condition shown with bold number. All  
 832 western blots are representative of three independent experiments. Data were  
 833 analyzed using two-way ANOVA followed by Bonferroni post-hoc test and  
 834 shown as mean values  $\pm$  SEM of three independent experiments. \* $p < 0.05$ ,  
 835 \*\* $p < 0.01$  and \*\*\* $p < 0.001$ . **Figure S8.** SMAD1 activation promotes the pro-  
 836 metastatic phenotype in MDA-MB-468 cells. A. SMAD1 target genes mRNA  
 837 levels were assessed using qRT-PCR in SMAD1-silenced MDA-MB-468 shGLO1  
 838 cells. SMAD1 mRNA level was assessed to validate efficient SMAD1 siRNA  
 839 silencing. (B) Migration ability toward serum of SMAD1-silenced MDA-MB-468  
 840 shGLO1 cells was assessed using Transwell filters. Representative filters are  
 841 shown for each condition. Scale bar represents 400  $\mu\text{m}$ . (C) Quantification of  
 842 migration assays of SMAD1-silenced MDA-MB-468 shGLO1 cells. (D) SMAD1  
 843 protein level assessed by immunoblot to validate SMAD1-silencing using siR-  
 844 NAs in GLO1-depleted MDA-MB-468 cells (related to panels B and C). Western  
 845 blots are representative of three independent experiments. Data were  
 846 analyzed using two-way ANOVA followed by Bonferroni post-hoc test and  
 847 shown as mean values  $\pm$  SEM of three independent experiments. \* $p < 0.05$ ,  
 848 \*\* $p < 0.01$  and \*\*\* $p < 0.001$ . **Figure S9.** GLO1 depletion is associated with a  
 849 global decrease of phosphatases expression in breast cancer cells. (A) mRNA

levels of PPP2 phosphatases (from catalytic, structural and regulatory subunits)  
 in GLO1-depleted MDA-MB-231 and MDA-MB-468 cells were assessed by qRT-  
 PCR. (B) DUSP1, 5, 8, 10, 12, 14 and 16 phosphatases mRNA levels in GLO1-  
 depleted MDA-MB-468 cells were quantified by qRT-PCR. Data were analyzed  
 using one-way ANOVA followed by Dunnett post-hoc test and shown as  
 mean values  $\pm$  SEM of three independent experiments. ns, not significant;  
 \* $p < 0.05$ , \*\* $p < 0.01$  and \*\*\* $p < 0.001$ . **Figure S10.** DUSP5 overexpression  
 decreases the migratory capacity of GLO1-depleted breast cancer cells.  
 Migration ability toward serum of DUSP5-overexpressing MDA-MB-231 (A) and  
 MDA-MB-468 (B) cells was assessed using Transwell filters. Representative filters  
 are shown for each condition. **Table S1.** Remarkable genes coding for ECM  
 components and ECM regulators, the expression of which is significantly  
 modulated in GLO1-depleted MDA-MB-231 breast cancer cells. Genes shown  
 in bold have been validated at the protein and/or mRNA expression levels.  
 ns, not significant. **Table S2.** DUSPs and PPPs subunits expression data from  
 RNASeq in GLO1-depleted MDA-MB-231 cells. Fold change and false discovery  
 rate (FDR) are shown for both shGLO1 clones. ns, not significant. **Table S3.**  
 Primer sequences and probes used for quantitative reverse transcription-PCR  
 (qRT-PCR). **Table S4.** Antibodies and dilution used for western blot  
 experiments. (PDF 2523 kb)

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#### Availability of data and materials

The datasets generated during the current study are available from the  
 corresponding author on reasonable request.

#### Authors' contributions

MJN, VC and AB conceived and designed the experiments. MJN, JB, FD, GR,  
 MG, CM, PR, CL and JS performed the experiments. BC, LV and SVL analyzed  
 the RNA sequencing data. MJN, OP, MH, CS, AC, JC, PD, AT, VC and AB  
 analyzed the data. MJN and AB wrote the main manuscript text. All authors  
 critically reviewed the manuscript. All authors read and approved the final  
 manuscript.

#### Ethics approval

All animal experimental procedures were performed according to the Federation  
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 reviewed and approved by the Institutional Animal Care and Ethics Committee of  
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#### Consent for publication

Not applicable.

#### Competing interests

The authors declare that they have no competing interests.

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926 **References**

927 1. Richard JP. Mechanism for the formation of methylglyoxal from  
 928 triosephosphates. *Biochem Soc Trans.* 1993;21(2):549–53.  
 929 2. Lo TW, Westwood ME, McLellan AC, Selwood T, Thornalley PJ. Binding and  
 930 modification of proteins by methylglyoxal under physiological conditions. A  
 931 kinetic and mechanistic study with N alpha-acetylglycine, N alpha-  
 932 acetylcysteine, and N alpha-acetylysine, and bovine serum albumin. *J Biol*  
 933 *Chem.* 1994;269(51):32299–305.  
 934 3. Rabbani N, Thornalley PJ. Methylglyoxal, glyoxalase 1 and the dicarbonyl  
 935 proteome. *Amino Acids.* 2012;42(4):1133–42.  
 936 4. Maessen DE, Stehouwer CD, Schalkwijk CG. The role of methylglyoxal and  
 937 the glyoxalase system in diabetes and other age-related diseases. *Clin Sci*  
 938 *(Lond).* 2015;128(12):839–61.  
 939 5. Rabbani N, Thornalley PJ. The dicarbonyl proteome: proteins susceptible to  
 940 dicarbonyl glycation at functional sites in health, aging, and disease. *Ann N*  
 941 *Y Acad Sci.* 2008;1126:124–7.  
 942 6. Nagaraj RH, Shipanova IN, Faust FM. Protein cross-linking by the Maillard  
 943 reaction. Isolation, characterization, and in vivo detection of a lysine-lysine  
 944 cross-link derived from methylglyoxal. *J Biol Chem.* 1996;271(32):19338–45.  
 945 7. Chiavarina B, Nokin MJ, Durieux F, Bianchi E, Turtoi A, Peulen O, Peixoto P,  
 946 Irigaray P, Uchida K, Belpomme D, et al. Triple negative tumors accumulate  
 947 significantly less methylglyoxal specific adducts than other human breast  
 948 cancer subtypes. *Oncotarget.* 2014;5(14):5472–82.  
 949 8. Chiavarina B, Nokin MJ, Bellier J, Durieux F, Bletard N, Sherer F, Lovinfosse P,  
 950 Peulen O, Verset L, Dehon R, et al. Methylglyoxal-mediated stress correlates  
 951 with high metabolic activity and promotes tumor growth in colorectal  
 952 cancer. *Int J Mol Sci.* 2017;18(1).  
 953 9. Nokin MJ, Durieux F, Bellier J, Peulen O, Uchida K, Spiegel DA, Cochrane JR,  
 954 Hutton CA, Castronovo V, Bellahcene A. Hormetic potential of  
 955 methylglyoxal, a side-product of glycolysis, in switching tumours from  
 956 growth to death. *Sci Rep.* 2017;7(1):11722.  
 957 10. Bellahcene A, Nokin MJ, Castronovo V, Schalkwijk C. Methylglyoxal-derived  
 958 stress: an emerging biological factor involved in the onset and progression of  
 959 cancer. *Semin Cancer Biol.* 2017.  
 960 11. Zender L, Xue W, Zuber J, Semighini CP, Krasnitz A, Ma B, Zender P, Kubicka  
 961 S, Luk JM, Schirmacher P, et al. An oncogenomics-based in vivo RNAi screen  
 962 identifies tumor suppressors in liver cancer. *Cell.* 2008;135(5):852–64.  
 963 12. Nokin MJ, Durieux F, Peixoto P, Chiavarina B, Peulen O, Blomme A, Turtoi A,  
 964 Costanza B, Smargiasso N, Baiwir D, et al. Methylglyoxal, a glycolysis side-  
 965 product, induces Hsp90 glycation and YAP-mediated tumor growth and  
 966 metastasis. *eLife.* 2016;5.  
 967 13. Oya T, Hattori N, Mizuno Y, Miyata S, Maeda S, Osawa T, Uchida K.  
 968 Methylglyoxal modification of protein. Chemical and immunochemical  
 969 characterization of methylglyoxal-arginine adducts. *J Biol Chem.* 1999;  
 970 274(26):18492–502.  
 971 14. Scheijen JL, Schalkwijk CG. Quantification of glyoxal, methylglyoxal and 3-  
 972 deoxyglucosone in blood and plasma by ultra performance liquid  
 973 chromatography tandem mass spectrometry: evaluation of blood specimen.  
 974 *Clin Chem Lab Med.* 2014;52(1):85–91.  
 975 15. Lambert CA, Soudant EP, Nussgens BV, Lapiere CM. Pretranslational  
 976 regulation of extracellular matrix macromolecules and collagenase  
 977 expression in fibroblasts by mechanical forces. *Lab Invest.* 1992;66(4):444–51.  
 978 16. Chen P, Cescon M, Bonaldo P. Collagen VI in cancer and its biological  
 979 mechanisms. *Trends Mol Med.* 2013;19(7):410–7.

17. Nomura Y, Tashiro H, Hisamatsu K. In vitro clonogenic growth and 980  
 metastatic potential of human operable breast cancer. *Cancer Res.* 1989; 981  
 49(19):5288–93. 982  
 18. Guttilla IK, Phoenix KN, Hong X, Tirnauer JS, Claffey KP, White BA. Prolonged 983  
 mammosphere culture of MCF-7 cells induces an EMT and repression of the 984  
 estrogen receptor by microRNAs. *Breast Cancer Res Treat.* 2012;132(1):75–85. 985  
 19. Kondaveeti Y, Guttilla Reed IK, White BA. Epithelial-mesenchymal transition 986  
 induces similar metabolic alterations in two independent breast cancer cell 987  
 lines. *Cancer Lett.* 2015;364(1):44–58. 988  
 20. Levental KR, Yu H, Kass L, Lakins JN, Egeblad M, Erler JT, Fong SF, Csiszar K, 989  
 Giaccia A, Weninger W, et al. Matrix crosslinking forces tumor progression 990  
 by enhancing integrin signaling. *Cell.* 2009;139(5):891–906. 991  
 21. Liu F, Hata A, Baker JC, Doody J, Carcamo J, Harland RM, Massague J. A 992  
 human Mad protein acting as a BMP-regulated transcriptional activator. 993  
*Nature.* 1996;381(6583):620–3. 994  
 22. Kretzschmar M, Liu F, Hata A, Doody J, Massague J. The TGF-beta family 995  
 mediator Smad1 is phosphorylated directly and activated functionally by 996  
 the BMP receptor kinase. *Genes Dev.* 1997;11(8):984–95. 997  
 23. Yue J, Frey RS, Mulder KM. Cross-talk between the Smad1 and Ras/MEK 998  
 signaling pathways for TGFbeta. *Oncogene.* 1999;18(11):2033–7. 999  
 24. Pannu J, Nakerakanti S, Smith E, ten Dijke P, Trojanowska M. Transforming 1000  
 growth factor-beta receptor type I-dependent fibrogenic gene program is 1001  
 mediated via activation of Smad1 and ERK1/2 pathways. *J Biol Chem.* 1002  
 2007;282(14):10405–13. 1003  
 25. Kretzschmar M, Doody J, Massague J. Opposing BMP and EGF signalling 1004  
 pathways converge on the TGF-beta family mediator Smad1. *Nature.* 1997; 1005  
 389(6651):618–22. 1006  
 26. Pouliot F, Labrie C. Role of Smad1 and Smad4 proteins in the induction of 1007  
 p21WAF1,Cip1 during bone morphogenetic protein-induced growth arrest 1008  
 in human breast cancer cells. *J Endocrinol.* 2002;172(1):187–98. 1009  
 27. Owens DM, Keyse SM. Differential regulation of MAP kinase signalling by 1010  
 dual-specificity protein phosphatases. *Oncogene.* 2007;26(22):3203–13. 1011  
 28. Stratmann B, Goldstein B, Thornalley PJ, Rabbani N, Tschoppe D. Intracellular 1012  
 accumulation of methylglyoxal by glyoxalase 1 knock down alters collagen 1013  
 Homeostasis in L6 myoblasts. *Int J Mol Sci.* 2017;18(3). 1014  
 29. Nagaharu K, Zhang X, Yoshida T, Katoh D, Hanamura N, Kozuka Y, Ogawa T, 1015  
 Shiraishi T, Imanaka-Yoshida K. Tenascin C induces epithelial-mesenchymal 1016  
 transition-like change accompanied by SRC activation and focal adhesion kinase 1017  
 phosphorylation in human breast cancer cells. *Am J Pathol.* 2011;178(2):754–63. 1018  
 30. Oskarsson T, Acharyya S, Zhang XH, Vanharanta S, Tavazoie SF, Morris PG, 1019  
 Downey RJ, Manova-Todorova K, Brogi E, Massague J. Breast cancer cells 1020  
 possess tenascin C as a metastatic niche component to colonize the lungs. 1021  
*Nat Med.* 2011;17(7):867–74. 1022  
 31. Baumann P, Cremers N, Kroese F, Orend G, Chiquet-Ehrismann R, Uede T, 1023  
 Yagita H, Sleeman JP. CD24 expression causes the acquisition of multiple 1024  
 cellular properties associated with tumor growth and metastasis. *Cancer* 1025  
*Res.* 2005;65(23):10783–93. 1026  
 32. Troup S, Njue C, Kliever EV, Parisien M, Roskelley C, Chakravarti S, Roughley 1027  
 PJ, Murphy LC, Watson PH. Reduced expression of the small leucine-rich 1028  
 proteoglycans, lumican, and decorin is associated with poor outcome in 1029  
 node-negative invasive breast cancer. *Clin Cancer Res.* 2003;9(1):207–14. 1030  
 33. Tung JC, Barnes JM, Desai SR, Sistrunk C, Conklin MW, Schedin P, Eliceiri KW, 1031  
 Keely PJ, Seewaldt VL, Weaver VM. Tumor mechanics and metabolic 1032  
 dysfunction. *Free Radic Biol Med.* 2015;79:269–80. 1033  
 34. Losi L, Bouzourene H, Benhattar J. Loss of Smad4 expression predicts liver 1034  
 metastasis in human colorectal cancer. *Oncol Rep.* 2007;17(5):1095–9. 1035  
 35. Liu N, Yu C, Shi Y, Jiang J, Liu Y. SMAD4 expression in breast ductal 1036  
 carcinoma correlates with prognosis. *Oncol Lett.* 2015;10(3):1709–15. 1037  
 36. Levy L, Hill CS. Smad4 dependency defines two classes of transforming 1038  
 growth factor (beta) (TGF-beta) target genes and distinguishes TGF-beta- 1039  
 induced epithelial-mesenchymal transition from its antiproliferative and 1040  
 migratory responses. *Mol Cell Biol.* 2005;25(18):8108–25. 1041  
 37. Kretzschmar M, Doody J, Timokhina I, Massague J. A mechanism of 1042  
 repression of TGFbeta/ Smad signaling by oncogenic Ras. *Genes Dev.* 1043  
 1999;13(7):804–16. 1044  
 38. Suzawa M, Tamura Y, Fukumoto S, Miyazono K, Fujita T, Kato S, Takeuchi Y. 1045  
 Stimulation of Smad1 transcriptional activity by Ras-extracellular signal- 1046  
 regulated kinase pathway: a possible mechanism for collagen-dependent 1047  
 osteoblastic differentiation. *J Bone Miner Res.* 2002;17(2):240–8. 1048  
 39. Guo Y, Zhang Y, Yang X, Lu P, Yan X, Xiao F, Zhou H, Wen C, Shi M, Lu J, 1049  
 et al. Effects of methylglyoxal and glyoxalase I inhibition on breast cancer 1050

- 1051 cells proliferation, invasion, and apoptosis through modulation of MAPKs,  
1052 MMP9, and Bcl-2. *Cancer Biol Ther.* 2015;0.  
1053 40. Warmoes MO, Locasale JW. Heterogeneity of glycolysis in cancers and  
1054 therapeutic opportunities. *Biochem Pharmacol.* 2014;92(1):12–21.  
1055 41. Sullivan LB, Gui DY, Heiden MG. Altered metabolite levels in cancer:  
1056 implications for tumour biology and cancer therapy. *Nat Rev Cancer.*  
1057 2016;16(11):680–93.

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