



α KG-induced oxidative stress and mTOR inhibition as a therapeutic strategy for liver cancer

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Abstract

Despite the availability of targeted therapies, liver cancer remains a severe health burden. The need for adjuvant therapy to improve treatment efficacy and prevent recurrence is emerging. Alpha-ketoglutarate (α KG) is an intermediate in the tricarboxylic acid cycle and a cofactor for various oxygenases. A critical role of this multifunctional metabolite has started to be revealed in physiological and pathological conditions. We found that α KG exerts various anti-tumor effects in liver cancer cells. Our kinetic transcriptome study suggested that increasing reactive oxygen species and inhibiting mTORC1 signaling underlies. Indeed, α KG treatment elevated oxidative stress and induced DNA damage, presumably caused by early downregulation of the antioxidant gene SLC7A11. Further, we validated impaired mTOR signaling and decreased cellular energy production. This unique mechanism underscores α KG's potential as a liver cancer therapy by harnessing oxidative stress and disrupting metabolic signaling. These findings could provide valuable insights into further exploration of α KG as a promising therapeutic agent in liver cancer.

Keywords Liver cancer · Alpha-Ketoglutarate · mTOR · Anti-tumor · ROS · ATP

Abbreviations

| | |
|-------------|-------------------------------------|
| α KG | Alpha-ketoglutarate |
| ROS | Reactive oxygen species |
| mTOR | Mechanistic target of rapamycin |
| JmjC | Jumonji C |
| DCFH-DA | 2',7'-Dichlorofluorescein diacetate |
| x_c^- | Cystine/glutamate antiporter system |
| OXPHOS | Oxidative phosphorylation |
| ATP | Adenosine triphosphate |
| NAFLD | Non-alcoholic fatty liver disease |
| TCA | Tricarboxylic acid |

Introduction

Liver cancer is a prevalent malignancy, and its incidence is closely linked to chronic infections with hepatitis viruses, as well as lifestyle factors such as alcohol consumption and

metabolic disorders [1]. These etiological factors contribute to the genomic instability and molecular complexity observed in liver cancer, resulting in limited therapeutic success for advanced-stage patients [2, 3]. Multi-targeted kinase inhibitors, such as sorafenib and lenvatinib, provide benefits in liver cancer treatment but often come with significant side effects, underscoring the need for novel treatments [4, 5]. Therefore, research focused on discovering more effective treatments or adjuvant therapies is essential to improve treatment outcomes for patients with liver cancer.

Alpha-ketoglutarate (α KG), a critical intermediate in the tricarboxylic acid (TCA) cycle, plays an integral role in cellular metabolism [6]. As a substrate in the TCA cycle, α KG facilitates the generation of reducing equivalents, such as NADH and FADH₂, which drive oxidative phosphorylation and ATP production in the electron transport chain [7, 8]. This process is essential for maintaining cellular energy supply, particularly in metabolically active cells [8, 9]. Interestingly, α KG inhibits ATP synthase activity under energy stress or nutrient deprivation, thereby limiting ATP production [10]. α KG's balanced involvement in energy production underscores its significance. In this context, α KG modulates cellular metabolic flux by regulating the mechanistic target of rapamycin (mTOR) pathway, a key regulator of cell growth and metabolism [11].

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The effect of α KG on mTOR signaling is highly context-dependent. Under nutrient-rich conditions, α KG activates mTOR, enhancing protein synthesis and promoting cell proliferation [12, 13]. Conversely, under metabolic stress, α KG suppresses mTOR activity to conserve ATP and prioritize survival pathways [10, 14].

α KG exhibits a context-dependent regulation of reactive oxygen species (ROS) levels. In normal states, α KG enhances antioxidant defenses by scavenging ROS and promoting glutathione synthesis, thereby preventing oxidative damage [15]. However, in cancer cells, α KG selectively increases ROS levels, disrupting redox homeostasis and pushing ROS beyond tolerable thresholds, leading to cellular dysfunction, ferroptosis, and apoptosis [16, 17]. The pro-apoptotic effects of α KG are further attributed to ROS-mediated ER stress and JNK/caspase-9 activation, highlighting these pathways as key mechanisms underlying α KG-induced cell death in cancer [18, 19]. α KG also serves as a critical cofactor for epigenetic enzymes, including TET dioxygenases and Jumonji C (JmjC) domain-containing histone demethylases [20]. Given that these enzymes regulate gene expression by modifying DNA and histone demethylation, their effects are expected to be genome-wide [21, 22]. Despite these insights, the role of α KG in epigenetic regulation, specifically in liver cancer, remains poorly understood.

This study explored the molecular mechanisms underlying the anticancer effects of α KG in liver cancer cells. Through kinetic transcriptome analysis, we demonstrated that α KG treatment significantly increased intracellular ROS levels, which subsequently inhibited the mTOR pathway, depleted ATP, and ultimately induced apoptosis. Our findings suggest that α KG could be a promising therapeutic strategy targeting unique vulnerabilities in liver cancer.

Materials and methods

Cell lines and culture

The liver cancer cell lines HepG2 and Huh7 were used in this study. HepG2 cells, widely utilized as a model for hepatocellular carcinoma, have also been referred to as hepatoblastoma cells in some studies (PubMed: 233137, 6248960, and 19751877). Huh7, derived from a well-differentiated hepatocellular carcinoma, is commonly employed to study liver cancer pathology and therapeutic responses. Both cell lines were kindly provided by Professor Suk Woo Nam from the Catholic University. Cells were maintained in DMEM (WELGENE, Cat. No. LM001-05) supplemented with 10% fetal bovine serum (WELGENE, Cat. No. S001-07) and 1% penicillin–streptomycin (GenDEPOT, Cat. No. CA005-010), incubated at 37 °C in a 5% CO₂ atmosphere.

α KG treatment

The α KG compound used was cell-permeable dimethyl- α KG (DM- α KG, Sigma-Aldrich, Cat. No. 349631-5G). The concentrations and treatment durations are detailed in the corresponding figure legends.

Cell proliferation assay

Cells were seeded at a density of 5×10^4 cells/well in six-well plates. Daily cell counts were conducted using a Trypan Blue exclusion assay, where 10 μ L of cell suspension was mixed with 10 μ L of Trypan Blue (Thermo Fisher Scientific, Cat. No. 15250061), and viable cells were counted using a hemocytometer under a light microscope.

RNA extraction and RT-qPCR

Total RNA was extracted using the easy-BLUE™ Total RNA Extraction Kit (iNtRON, #17061) following the manufacturer's protocol. Complementary DNA (cDNA) was synthesized from 1 μ g of total RNA using the High Capacity cDNA Reverse Transcription Kit (Applied Biosystems, #4368813), according to the manufacturer's instructions. Real-time quantitative PCR (RT-qPCR) was performed using the CFX Connect™ Real-Time PCR Detection System (BIO-RAD, Hercules, CA, USA) with iQ™ SYBR® Green Supermix (BIO-RAD, #170-8882AP). The following primers were used for SLC7A11: Forward 5'-CTG AGC GGC TAC TGG GAA AT-3', Reverse 5'-TGG TAG AGG AGT GTG CTT GC-3'.

Western blot analysis

Cells were lysed in RIPA buffer (CELLNEST, Cat. No. CNR001-0100) supplemented with protease inhibitors (Abbkine, Cat. No. BMP1001) and sonicated briefly to ensure complete lysis. Protein concentrations were measured with the Bradford assay (Bio-Rad, Cat. No. 5000006). Equal protein amounts (30 μ g) were loaded onto 8–15% SDS-PAGE gels and electrophoresed. After transfer to nitrocellulose membranes (Bio-Rad, Cat. No. 1620115), membranes were blocked with 10% skim milk (Difco, Cat. No. 232100) in TBS-T for 1 h, then probed overnight at 4 °C with primary antibodies (Supplementary Table 1). Membranes were incubated with HRP-conjugated secondary antibodies (1:10,000) at room temperature for 1 h. Blots were developed using ECL (Abfrontier, Cat. No. LF-QC0103), and band intensities were quantified using ImageJ software.

Apoptosis

Apoptosis was measured using an Annexin V-FITC Apoptosis Detection Kit (BD Biosciences, Cat. No. 556547). Cells were washed in PBS, and then resuspended in 500 μ L binding buffer. After adding 5 μ L of Annexin V-FITC and 5 μ L of PI, the samples were incubated in the dark for 15 min. Stained cells were analyzed using a BD Accuri C6 flow cytometer (BD Biosciences), and data were processed with FlowJo software.

Wound healing assay

Cells were cultured to confluence in six-well plates and starved overnight in serum-free DMEM. A scratch was made with a sterile 200 μ L pipette tip, and wells were rinsed with PBS to remove detached cells. Images were taken immediately (0 h) and at 24, 48, and 72 h using a light microscope (OLYMPUS IX71 Research Inverted Microscope), and gap widths were measured to assess migration.

Microarray

Labeled cRNA was generated from 1–5 μ g of total RNA using Agilent's Quick Amp Labeling Kit. After fragmentation, 1.65 μ g of labeled cRNA was hybridized onto the Agilent expression microarray, following the manufacturer's protocol. The arrays were scanned using the Agilent Technologies G4900DA SG12494263 scanner. Data export, processing, and analysis were performed using Agilent Feature Extraction software (v11.0.1.1). The microarray data set was sourced from the NCBI Gene Expression Omnibus (GEO) database (accession no. GSE279001).

ROS measurement

Cells were seeded into a 24-well plate and incubated for 24 h at 37 °C in a CO₂ incubator. After incubation, cells were washed with Hank's Balanced Salt Solution (HBSS, Sigma H6648) and treated with 20 μ M carboxy-H₂DCF-DA (Molecular Probes, #C-400) in HBSS, followed by incubation at 37 °C for 10 min. Excess carboxy-H₂DCF-DA was removed by washing the cells with HBSS, and 1 mL of fresh HBSS was added. The cells were incubated for 120 min, then washed twice with cold HBSS, and lysed with 0.5% Triton X-100 (diluted in PBS) for 5 min. Fluorescence intensity was measured using a multi-well plate reader at an excitation wavelength of 485 nm and emission wavelength of 530 nm.

Comet assay

DNA damage was assessed using the OxiSelect™ Comet Assay Kit (Cell Biolabs, Cat. No. STA-351) according

to the manufacturer's protocol. Cells were embedded in low-melting-point agarose on comet slides and electrophoresed. DNA was stained with Vista Green DNA Dye (Cell Biolabs), and comet tail lengths were quantified using a fluorescence microscope (OLYMPUS IX71 Research Inverted Microscope).

ATP level measurement

Intracellular ATP levels were quantified using the ATeam1.03-nD/nA/pcDNA3 plasmid (Addgene, Cat. No. 51958) transfected into cells. Fluorescence was measured using a microplate reader, and data were analyzed with ImageJ.

Statistical analysis

Data are presented as mean \pm SEM. Statistical significance was determined using a one-way ANOVA followed by Tukey's post hoc test for multiple comparisons, with significance levels set at $*P < 0.05$, $**P < 0.01$, and $***P < 0.001$. All experiments were performed in triplicate ($n = 3$) to ensure reproducibility. Statistical analyses were conducted using Prism.

Result

α KG reduces liver cancer cell viability by inhibiting growth and migration

To investigate the potential anti-tumor effects of α KG on liver cancer cells, we treated HepG2 and Huh7 cells with cell-permeable α KG (Dimethyl 2-oxoglutarate, DM- α KG) at varying concentrations and time points. Our results demonstrated a dose- and time-dependent decrease in cell viability in both cell lines, confirmed by significant inhibition of cell proliferation (Fig. 1A, B). This reduction in proliferation coincided with the activation of apoptotic pathways, as indicated by cleaved caspase-3 and confirmed by annexin V-FITC and propidium iodide co-staining, markers of early apoptosis (Fig. 1C, D). These findings suggest that α KG not only reduces proliferation but actively promotes programmed cell death. Furthermore, α KG impaired liver cancer cell migration, as demonstrated by wound healing assays, indicating an additional effect on tumor progression (Fig. 1E). Together, these results provide initial evidence that α KG exerts anti-tumor effects by inhibiting cell proliferation, inducing apoptosis, and reducing cell migration.

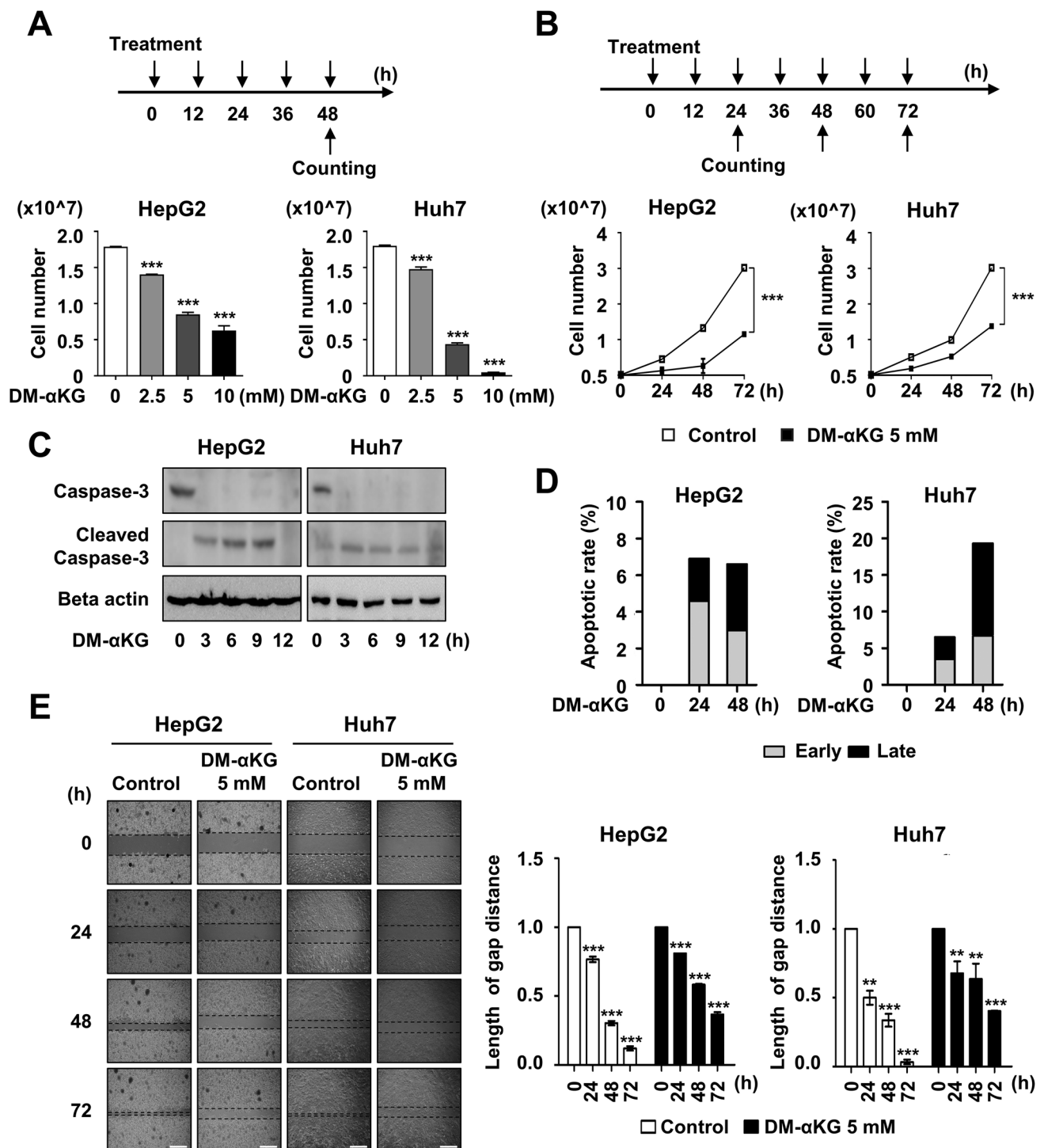


Fig. 1 αKG exhibits anti-tumor effects. **A** Dose-dependent effect of DM-αKG on the proliferation of HepG2 and Huh7 cells (mean ± SEM, *** p < 0.001, n = 3). **B** Time-dependent effect of DM-αKG on the proliferation of HepG2 and Huh7 cells (mean ± SEM, *** p < 0.001, n = 3). **C** Protein levels of Caspase-3,

Cleaved Caspase-3, and Beta actin in HepG2 and Huh7 cells following DM-αKG treatment. **D** Time-dependent induction of apoptosis in HepG2 and Huh7 cells treated with DM-αKG. **E** Time-dependent effect of DM-αKG on wound healing in HepG2 and Huh7 cells (mean ± SEM, ** p < 0.01, *** p < 0.001, n = 3) (Scale bar = 500 μm)

Kinetic transcriptome analysis reveals early α KG-induced changes in ROS and mTORC1 signaling pathways in liver cancer

Previous studies have shown that α KG exerts anticancer effects by promoting prolyl hydroxylase (PHD) activity, destabilizing HIF-1 α , and impairing hypoxic adaptation in certain cancer types, including breast, colon, and melanoma cancers and glioblastoma [23–25]. To determine whether this mechanism is operative in liver cancer, we investigated the cell type-specific effects of α KG on HIF-1 α expression in liver cancer cells. Interestingly, α KG increased HIF-1 α expression in HepG2 cells, which exhibit inherently low basal levels of HIF-1 α , while it decreased HIF-1 α expression in Huh7 cells, which have relatively high basal levels. These findings suggest that PHD-HIF-1 α modulation may not be the primary pathway in liver cancer. Another established anti-tumor mechanism of α KG involves p53-mediated tumor suppression in pancreatic ductal adenocarcinoma [26]. However, we observed similar anti-tumor effects in both p53-wild-type and p53-deficient liver cancer cells, suggesting a p53-independent mechanism (Fig. 2A). Additionally, we did not observe autophagy inhibition, another known anticancer mechanism of α KG [27], indicating that autophagy is not a key pathway in liver cancer (Fig. 2A). To elucidate the underlying mechanism of the α KG anti-tumorigenic effect, we performed kinetic transcriptome analysis with control samples (0 h) in duplicate ($n=2$), and all other time points (3, 6, 9, 12, 24, and 48 h) as single replicates ($n=1$). We categorized the time points into four groups based on the duration of DM- α KG treatment and their distinct gene expression patterns: control (0 h), early (3 and 6 h), intermediate (9 and 12 h), and late (24 and 48 h) time points (Fig. 2B). Multi-dimensional scaling (MDS) plot showed the most distinct gene expression changes at early time points compared to control, while intermediate and late samples gradually converged toward the control, indicating a rapid but transient transcriptional response to DM- α KG (Fig. 2C). We also analyzed ferroptosis, another reported anticancer mechanism of α KG, and observed a significant reduction in SLC7A11 expression. However, the concomitant decrease in CHAC1 expression contradicted the expected ferroptosis-associated gene expression pattern (Fig. 2D). Gene set enrichment analysis (GSEA) further confirmed the absence of ferroptosis activation, as ferroptosis-related gene sets showed no significant enrichment (Fig. 2E). These findings suggest that ferroptosis is not the primary mechanism underlying α KG's anti-tumor effects in liver cancer cells. Based on expression profiles, we divided the genes into eight groups (Fig. 2F). The two majority groups showed early change and lasted: UUU (group 1) and DDD (group 8). The REACTIVE_OXYGEN_SPECIES pathway and MTORC1_SIGNALING pathway were the hallmark pathways of group 1 and

group 8, respectively, in response to α KG treatment. Kinetic transcriptome analysis reveals upregulation of the REACTIVE_OXYGEN_SPECIES pathway, indicating increased oxidative stress within cells. Concurrently, consistent downregulation of the MTORC1_SIGNALING pathway suggests impaired cell growth and survival (Fig. 2G, H). These findings collectively propose that ROS-induced oxidative stress and mTORC1 signaling dysregulation are key mechanisms underlying the α KG-mediated anti-tumor response in liver cancer.

α KG elevates ROS levels and induces DNA damage in liver cancer cells

To investigate the mechanism underlying α KG-induced cell death, we assessed ROS levels and DNA damage in liver cancer cells. α KG significantly increased ROS levels in both HepG2 and Huh7 cells, as measured by dichlorofluorescein diacetate (DCFH-DA) staining (Fig. 3A). Furthermore, a comet assay demonstrated increased DNA damage in α KG-treated cells compared to controls (Fig. 3B), suggesting that ROS-induced DNA damage may contribute to α KG-mediated apoptosis (Fig. 1C, D). Notably, we observed a significant downregulation of SLC7A11, a critical component of the cystine/glutamate antiporter system (x_c^-) [28], upon α KG treatment (Fig. 3C), which was further confirmed by RT-qPCR, showing a significant, time-dependent reduction in SLC7A11 mRNA levels in both HepG2 and Huh7 cells (Fig. 3D). While global histone modifications, such as H3K4me3 and H3K9me3, remained relatively unchanged (Fig. 3E). Since the x_c^- system is essential for maintaining cellular redox balance, the selective repression of SLC7A11 by α KG likely enhances ROS production and oxidative stress.

α KG suppresses mTOR signaling and reduces cellular ATP production

To validate the findings from our kinetic transcriptome analysis, we aimed to determine whether α KG directly regulates the mTOR pathway in liver cancer cells. GSEA revealed a significant downregulation of the HALLMARK_MTORC1_SIGNALING and PI3K_AKT_MTOR_SIGNALING pathways in response to α KG treatment (Fig. 4A). We observed a marked reduction in the phosphorylation levels of S6 (p-S6) and 4EBP1 (p-4EBP1) during the early phases (Fig. 4B), indicating early suppression of mTOR signaling by α KG. This mTOR inhibition correlated with the downregulation of gene sets involved in oxidative phosphorylation (OXPHOS), glycolysis, and ATP synthesis (Fig. 4C). α KG treatment caused a significant reduction in cellular ATP levels, similar to the effect of nutrient deprivation, indicating impaired energy metabolism (Fig. 4D). These findings

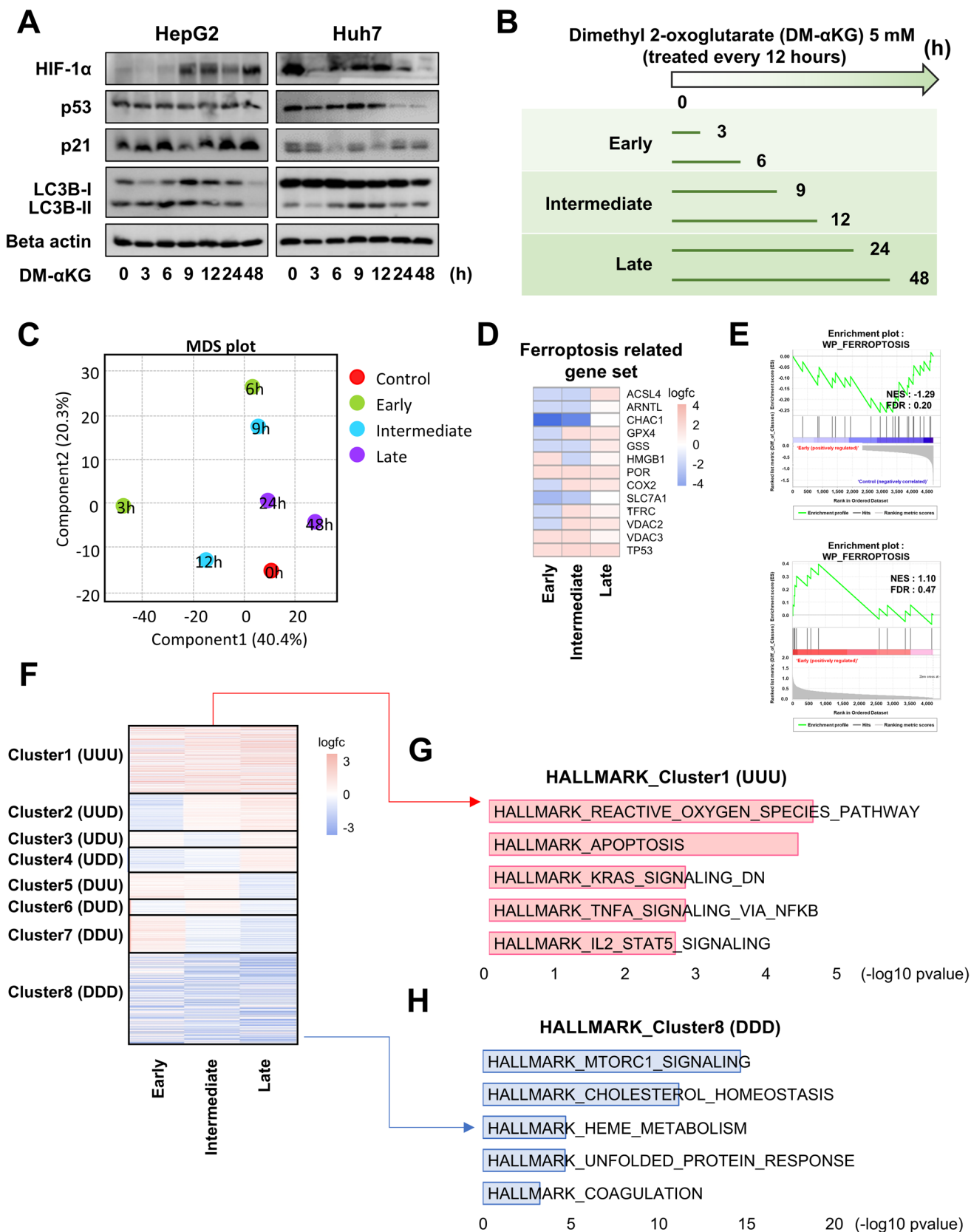


Fig. 2 DM- α KG alters transcriptome patterns in liver cancer cells. **A** Protein levels of HIF-1 α , p53, p21, LC3B-I, LC3B-II, and Beta actin in HepG2 and Huh7 cells following DM- α KG treatment. **B** Schematic representation of the experimental design for DM- α KG treatment in liver cancer cells. **C** MDS plot showing transcriptome clustering of Control and DM- α KG-treated samples at different time points (3, 6, 9, 12, 24, and 48 h). **D** Expression changes in the ferroptosis-related gene set at early, intermediate, and late time points following DM- α KG treatment. Fold changes were calculated by normalizing each time point to the control condition. **E** GSEA analysis following DM- α KG treatment. **F** Gene expression changes in HepG2 cells after DM- α KG treatment. Time points (early, intermediate, and late) are categorized into upregulated and downregulated genes relative to the control (0 h), represented by eight groups. Fold changes were calculated by normalizing each time point to the control condition. U indicates upregulation, while D indicates downregulation. **G** Hallmark pathway analysis of genes consistently upregulated (UUU) across early, intermediate, and late time points following DM- α KG treatment in HepG2 cells. **H** Hallmark pathway analysis of genes consistently downregulated (DDD) across early, intermediate, and late time points following DM- α KG treatment in HepG2 cells

support a model where α KG inhibits mTOR signaling, leading to reduced ATP production likely via ROS-mediated mechanisms.

Discussion

In this study, we explored the anticancer potential of α KG in liver cancer cells, focusing on early gene expression changes identified through kinetic transcriptome analysis. α KG treatment increased ROS levels, resulting in mTORC1 suppression, elevated oxidative stress, DNA damage, and reduced ATP production (Fig. 4E). These effects were validated through direct measurements of ROS, DNA damage, and ATP levels. Given the role of ROS as upstream regulators of mTOR signaling, downregulation of SLC7A11 might be the very upstream of effects. This study provides the first evidence of α KG's impact on liver cancer through this

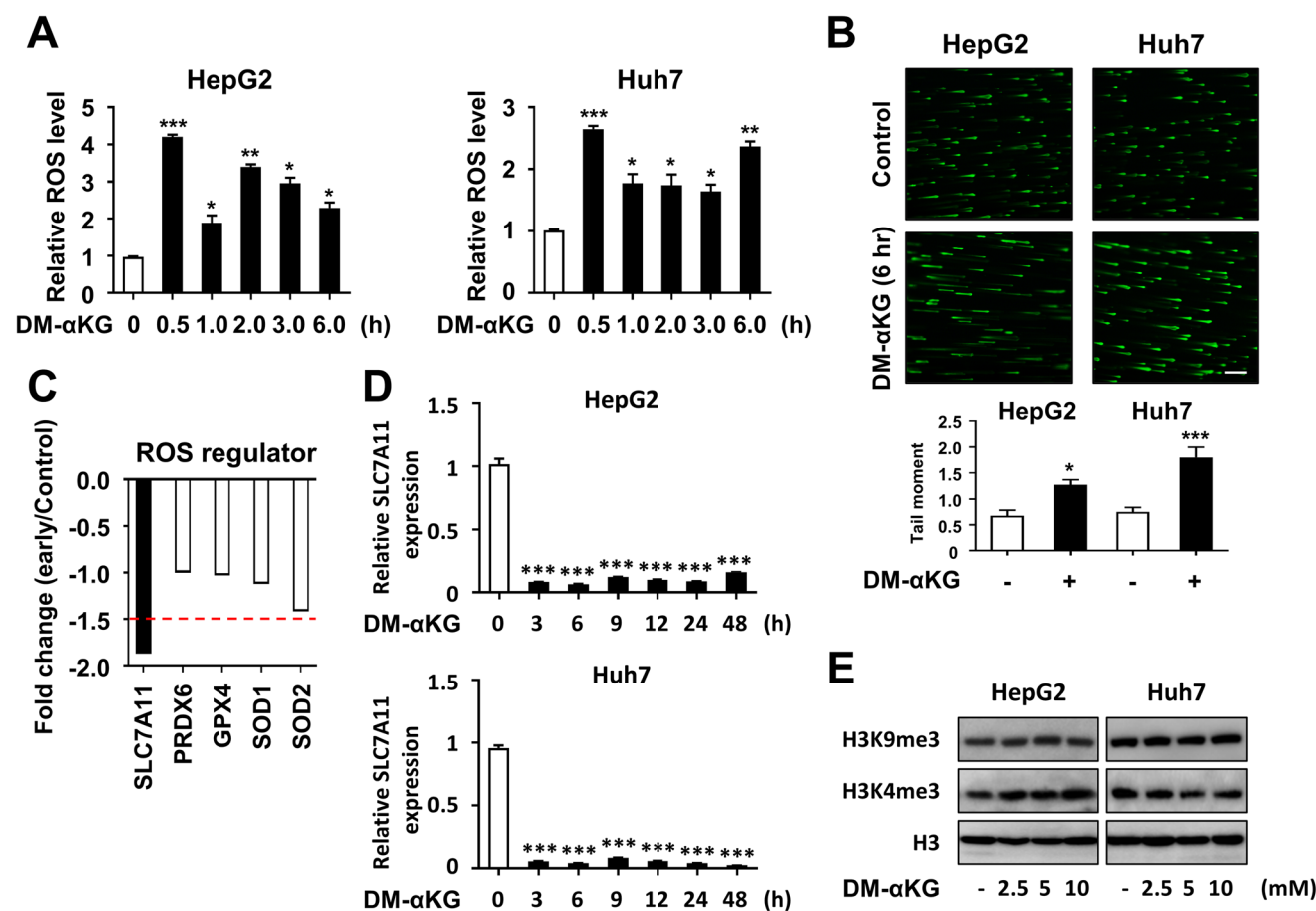


Fig. 3 α KG treatment increases ROS levels. **A** ROS levels measured by DCF fluorescence intensity in HepG2 and Huh7 cells following DM- α KG treatment (mean \pm SEM, * p < 0.05, ** p < 0.01, *** p < 0.001, n = 3). **B** Representative images of comet assay illustrating the degree of DNA damage and quantification of comet tail moments in HepG2 and Huh7 cells after DM- α KG treatment

(mean \pm SEM, * p < 0.05, *** p < 0.001, n = 3) (Scale bar = 200 μ m). **C** Fold changes in ROS regulator expression based on microarray analysis following DM- α KG treatment. **D** Relative SLC7A11 expression in HepG2 and Huh7 cells following DM- α KG treatment (mean \pm SEM, *** p < 0.001, n = 3). **E** Protein levels of H3K4me3, H3K9me3, and H3 in HepG2 and Huh7 cells after DM- α KG treatment

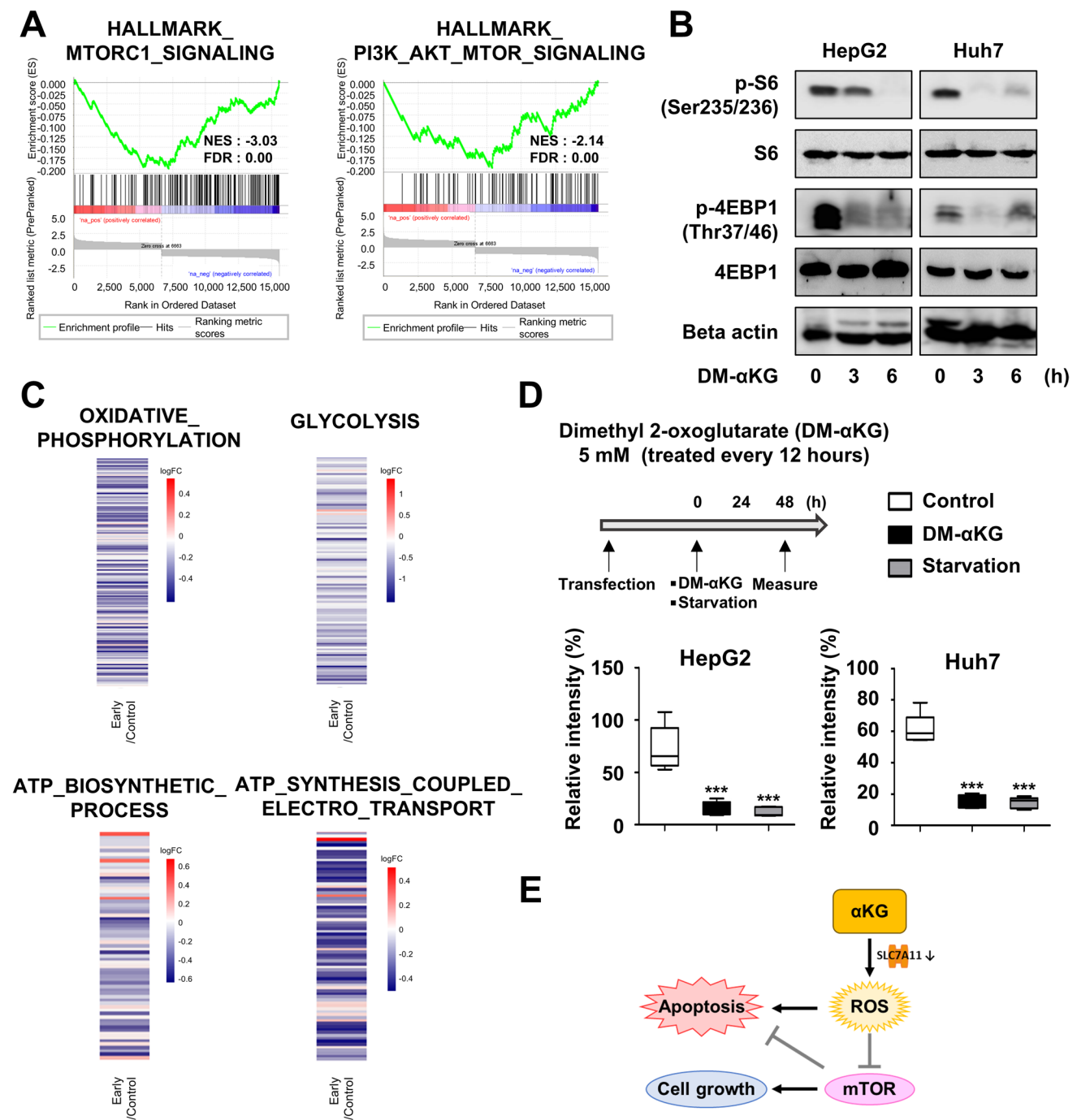


Fig. 4 αKG suppresses mTOR signaling in liver cancer cells. **A** GSEA analysis following DM-αKG treatment. **B** Protein levels of p-S6, S6, p-4EBP1, 4EBP1, and Beta actin in HepG2 and Huh7 cells following DM-αKG treatment. **C** Gene expression changes observed at early time points post-DM-αKG treatment. The corresponding

gene list is provided in the supplementary Table 2–5. **D** Schematic representation of the experimental design and ATP levels in HepG2 and Huh7 cells following DM-αKG treatment and under starvation conditions. **E** Summary diagram illustrating the overall effects of αKG treatment in liver cancer cells

mechanism, highlighting its therapeutic potential to disrupt key processes vital for tumor progression.

The therapeutic potential of αKG in non-alcoholic fatty liver disease (NAFLD) has been attributed to its beneficial effects on lipid metabolism and liver function [11, 29].

Preclinical studies have shown that cell-permeable αKG formulations can inhibit tumor growth in several cancer types [11, 30]. However, the anti-tumor potential of αKG in liver cancer has not been previously explored. This study is the first to demonstrate that αKG inhibits tumor growth in liver

cancer cells, providing a novel and promising therapeutic strategy. The ROS-mediated inhibition of mTOR observed in liver cancer may offer valuable insights into new therapeutic approaches. Nevertheless, further research is needed to determine whether this ROS-mTOR pathway is specific to liver cancer or applicable to a broader range of tumor types. Although α KG may act as an epigenetic cofactor for the SLC7A11 gene, reducing its expression, other ROS-generating mechanisms should not be overlooked. To fully harness the therapeutic potential of α KG, a deeper understanding of the interplay between cellular redox balance and gene regulation is crucial.

Previous research has highlighted the use of mTOR inhibitors in liver cancer treatment. Traditional inhibitors, such as rapamycin and its analogs (rapalogs), target mTORC1 and have demonstrated efficacy in early-stage liver cancer [31]. However, their therapeutic efficacy in advanced liver cancer is limited by drug resistance, incomplete mTORC1 inhibition, and compensatory mTORC2 activation. Moreover, rapalogs are linked to adverse effects, such as immunosuppression and toxicity, which restrict their long-term use [32, 33]. Our study suggests that α KG may offer an alternative route to inhibit mTOR activity through a ROS-driven mechanism. However, the clinical potential of α KG as a substitute for rapalogs remains uncertain, and its efficacy in combination with other anticancer therapies needs further investigation. Additionally, our study was conducted in vitro, limiting the direct applicability of these results to in vivo settings. Further studies are needed to validate these findings in animal models and to evaluate potential off-target effects or toxicity.

Conclusion

Our findings represent the first evidence that α KG can exert anti-tumor effects in liver cancer. Elevated ROS caused by presumable downregulation of SLC7A11 by α KG inhibits mTOR signaling. This disrupts cellular energy homeostasis, induces oxidative stress, and triggers DNA damage. Therefore, α KG offers a new therapeutic approach that could enhance the efficacy of current treatment strategies. Further exploration of the context-specific action mechanisms of α KG will improve its potential clinical applications for various diseases, including cancer.

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contributed to the conceptualization, data curation, formal analysis, supervision, funding acquisition, and writing and editing of the manuscript. All authors reviewed and approved the final manuscript.

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Data availability The accession number for gene expression data reported in this study is NCBI GEO: GSE279001.

Declarations

Conflict of interest The authors declare no competing interests.

Ethical approval Not applicable.

Consent to participate Not applicable.

Informed consent All participants provided written informed consent before participation in the study.

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