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# **Induction of oxidative‑ and endoplasmic‑reticulum‑stress dependent apoptosis in pancreatic cancer cell lines by DDOST knockdown**

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**The dolichyl-diphosphooligosaccharide-protein glycosyltransferase non-catalytic subunit (DDOST) is a key component of the oligosaccharyltransferase complex catalyzing** *N***-linked glycosylation in the endoplasmic reticulum lumen. DDOST is associated with several cancers and congenital disorders of glycosylation. However, its role in pancreatic cancer remains elusive, despite its enriched pancreatic expression. Using quantitative mass spectrometry, we identify 30 diferentially expressed proteins and phosphopeptides (DEPs) after DDOST knockdown in the pancreatic ductal adenocarcinoma (PDAC) cell line PA-TU-8988T. We evaluated DDOST / DEP protein–protein interaction networks using STRING database, correlation of mRNA levels in pancreatic cancer TCGA data, and biological processes annotated to DEPs in Gene Ontology database. The inferred DDOST regulated phenotypes were experimentally verifed in two PDAC cell lines, PA-TU-8988T and BXPC-3. We found decreased proliferation and cell viability after DDOST knockdown, whereas ER-stress, ROS-formation and apoptosis were increased. In conclusion, our results support an oncogenic role of DDOST in PDAC by intercepting cell stress events and thereby reducing apoptosis. As such, DDOST might be a potential biomarker and therapeutic target for PDAC.**

Pancreatic ductal adenocarcinoma (PDAC) is a devastating disease, characterized by late diagnosis, early metastasis, limited response to chemotherapy and poor prognosis<sup>1</sup>. Despite significant advances in understanding the pathobiology of the disease in recent decades, PDAC is predicted to be the third leading cause of cancer related mortality in Europe by 202[52](#page-10-1) , in part refecting the increasing prevalence of the risk factors obesity, diabetes and alcohol consumption, but also the lack of successful therapies<sup>[3](#page-10-2)</sup>. PDAC arises from the exocrine tissue, which is characterized by a high protein expression and secretion capacity.

Secretory proteins undergo *N*-linked glycosylation during their endoplasmic reticulum (ER) transit. In this process, a pre-assembled core oligosaccharide can be attached to the asparagine (Asn) residue of the Asn-Xaa-Ser/Thr motif (Sequon) in the nascent polypeptide chain, by the oligosaccharyltransferase (OST) complex as it enters the ER lumen<sup>[4](#page-10-3)</sup>. N-linked oligosaccharides can promote protein folding by increasing the stability of the unfolded polypeptide chain, preventing aggregation, and allowing cell surface glycoproteins to localize on the cell surfac[e5](#page-10-4) . OST complexes catalyzing *N*-linked glycosylation consist of 12 proteins, including the STT3 OST complex catalytic subunit A and B (STT3A, STT3B), defender against cell death 1 (DAD1), ribophorin 1 (RPN1), ribophorin 2 (RPN2) and dolichyl-diphosphooligosaccharide–protein glycosyltransferase non-catalytic subunit (DDOST[\)6](#page-10-5) . As an important post-translational modifcation, *N*-linked glycosylation plays a critical role in the

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folding, stability, subcellular localization, and biological function of glycoproteins. Aberrant *N*-linked glycosylation has been widely recognized as an important characteristic of various cancers, such as colorectal, breast or liver cancer and correlates with tumor development, progression, metastasis, and chemo resistance<sup>7–10</sup>. Knockdown (KD) of drosophila DAD1 (dDAD1) or human RPN1 induces ER stress-dependent apoptosis, whereas expression levels of several OST subunits including RPN1, RPN2, STT3A STT3B, and DDOST were upregulated in breast cance[r11](#page-10-8)[,12.](#page-10-9) Interestingly, in PDAC cell lines, the glycolytic inhibitor 2-deoxy-D-glucose (2DG) reduces protein *N*-glycosylation and induces ER related apoptosis<sup>13</sup>. Of note, inhibiting the OST complex and thereby, *N*-linked glycosylation of proteins, was found to induce ER stress-dependent apoptosis<sup>[11](#page-10-8),12</sup>. In tumor cells, protein processing in the ER is ofen impaired either intrinsically, exemplarily by oncogenic activation, or extrinsically, by hypoxic, acidic and nutrient deprived milieu<sup>[14](#page-10-11)</sup>. Consequently, the accumulation of misfolded proteins in the ER lumen results in ER stress. Tis induces the unfolded protein response (UPR) to enhance clearance capacities and thus restore ER homeostasis. Although the UPR is an important cytoprotective response, prolonged ER stress can nevertheless lead to apoptosis $14,15$  $14,15$ .

A recent study compared the expression of DDOST between gliomas and normal brain tissue in the Gene Expression Omnibus (GEO) and Chinese Glioma Genome Atlas (CGGA) databases. In glioma patients, high levels of DDOST correlated with aggressiveness and an altered immunosuppressive microenvironment<sup>16</sup>. In hepatocellular carcinoma (HCC), high DDOST expression was found to be associated with poorer overall and disease-specific survival of HCC patients<sup>17</sup>. Besides the well-established function as OST-complex subunit, DDOST was identified as a potential receptor for advanced glycation end products (AGE-R1)<sup>18</sup> and as such, acted as suppressor for cell oxidant stress and activation signaling via the epidermal growth factor receptor (EGFR) in mesangial and embryonic kidney cells $^{19}$  $^{19}$  $^{19}$ .

In summary, DDOST expression has been shown to be relevant in distinct cancers, but little is known about the function of DDOST in the development and progression of PDAC from functional studies or public domain databases. Here, we demonstrate that DDOST affects several biological processes important for proliferation, oxidative stress and apoptosis at the proteome and phosphoproteome level in PDAC cell lines. We also show that oxidative and ER stress-induced cell apoptosis inhibits cell viability afer DDOST KD.

#### **Results**

## **Proteomic analysis in PDAC cells identifes diferentially expressed and phosphorylated pro‑ teins upon DDOST KD**

Interestingly, a quantitative proteome map in healthy human body donors revealed that DDOST is tissue-specifcally enriched in pancreas (Fig. [1\)](#page-2-0), indicating an important role in pancreatic function and possibly a role in pancreatic tumorigenesis<sup>20</sup>. Moreover, in different PDAC tumor cell lines, ranging from BXPC-3 and PA-TU-8988T (Fig. [2A](#page-3-0)) to PANC-1 (Fig. S1) we found DDOST protein expression in western blot analysis consistently.

To unravel potential regulative efects on the proteome, including the phosphoproteome, by DDOST we performed KD experiments of DDOST in the PDAC cell line PA-TU-8988T followed by quantitative LC–MS/ MS. Cells were each transiently transfected with two homolog-specifc siRNA pools to KD DDOST expression. KD efficiency was analyzed by both, qRT-PCR and western blot analysis. DDOST expression was reduced successfully by an average of 75% in the cell lines PA-TU-8988T and BXPC-3 compared to a non-targeting control siRNA (*P*<0.05, Fig. [2A](#page-3-0)–C). To identify all proteins and phosphopeptides regulated by DDOST in the pancreatic cancer cell line PA-TU-8988T, we performed a quantitative proteome analysis by TMT-labeling and LC–MS/ MS, including an additional phosphopeptide enrichment step, afer DDOST KD. In summary, 1577 proteins and 2059 phosphopeptides in 883 proteins were identified (Supplemental Table S1; Supplemental Table S2). The expression levels of eight proteins were signifcantly increased, while 14 proteins and eight phosphopeptides in five proteins were significantly decreased (FDR < 0.05, Fig. [2](#page-3-0)D–G). Notably, besides DDOST, two additional OST complex DEPs were down-regulated, the protein RPN2 (Ribophorin II) (FDR=0, log2-FC=−0.81) and two phosphopeptides of the protein STT3B (STT3 Oligosaccharyltransferase Complex Catalytic Subunit B)  $(FDR = 0, log2-FC = -0.81 / -0.66).$ 

## **Protein–protein interaction analysis provides information on correlations between identifed proteins and phosphopeptides in public domain databases**

A functional network of diferentially expressed proteins and phosphopeptides (DEPs, Supplemental Table S3) was constructed from the STRING database to evaluate known and potential protein–protein-interactions (PPI). The resulting PPI network consisted of 26 nodes and 67 edges, with each node representing all splice isoforms or post-translational modifcations of each analyzed DEP and each edge representing all predicted or functional associations. The resulting network contains significantly more interactions than expected for a random group of proteins of the same size and degree distribution from the genome (PPI enrichment *P*=2.83× 10−4, Fig. [3A](#page-4-0)).

Next, we performed a spearman correlation analysis of *DDOST* mRNA-expression levels with each of the identifed DEPs in 179 pancreatic adenocarcinoma (PAAD) tumor tissue samples (Fig. [3B](#page-4-0)). We found the strongest correlations between *DDOST* and *RPN2* (*ρ*=0.77, *P*<1.00× 10−4), *SERBP1* (*ρ*=0.76, *P*<1.00× 10−4), *CALU* (*ρ*=0.72, *P*<1.00× 10−4), *STT3B* (*ρ*=0.72, *P*<1.00× 10−4), *YWHAZ* (*ρ*=0.68, *P*<1.00× 10−4), *MAPK1* (*ρ*=0.65,  $P < 1.00 \times 10^{-4}$ ). Additionally, 16 significant correlations with  $\rho \ge 0.5$  ( $P < 1.00 \times 10^{-4}$ ) and 3 correlations with  $\rho$  ≥ 0.39 (*P* < 1.00 × 10<sup>-4</sup>) were detected (Supplemental Table S3).

# **GO annotation analyses identifes biological processes enriched for DEPs.**

To determine biological processes in which the here identifed DEPs may participate, we assessed functional enrichments in the network of DEPs using STRING (Cellular Components, Gene Ontology) $2^{1,22}$ . We found two complexes enriched, including five of our identified DEPs, the OST complex (FDR =  $2.80 \times 10^{-3}$  included DEPs:

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# Protein expression of DDOST in normal human tissues

<span id="page-2-0"></span>**Figure 1.** Tissue Specifcity Scores of DDOST protein expression in human body donors. If a gene has TS (tissue specifcity) scores at least in one tissue≥2.5, this gene is called tissue-enriched. Vertical lines indicate the threshold values of 2.5 and 4. Adapted from "A Quantitative Proteome Map of the Human Body" by Jiang et al., 2020.

RPN2, STT3B, DDOST) and the amino acid transport complex (FDR=0.01; included DEPs: SLC7A5, SLC3A2) (Supplemental Table S4), suggesting an impact of DDOST on the OST complex function.

Next, we applied the function enrichment analysis of the GADO tool<sup>23</sup> using gene co-regulation to improve prediction of pathway membership, to the here identifed DEPs. We found a signifcant enrichment of the protein glycosylation pathway (*P*=0.02, Table S5, highlighted in red), further supporting a potential impact on protein glycosylation by inference with the OST complex. Moreover, we also found numerous biological processes related to carcinogenesis signifcantly enriched (Supplemental Table S5, highlighted in red), ranging from *negative regulation of apoptotic process*, *cell proliferation, cellular response to oxidative stress* and *response to unfolded protein* (*P*=2.54× 10−6, *P*=5.35× 10−4, *P*=1.12× 10−3, *P*=1.18× 10−3, respectively, Fig. [3](#page-4-0)C and Supplemental Table S5) to *response to endoplasmic reticulum stress* ( $P = 0.03$ , Supplemental Table S5), suggesting an impact of deregulated OST complex by DDOST KD on typical phenotypes, that are common for tumor development.

# **Phenotypical assays verify efects of DDOST KD on proliferation, viability, ER‑stress, oxida‑ tive stress and apoptosis in PDAC cell lines**

We performed DDOST KD experiments in the PDAC cell lines BXPC-3 and PA-TU-8988T to assess the impact on cell growth, viability, ER stress, ROS-formation and apoptosis. Tunicamycin (TM) as inhibitor of *N*-linked glycosylation was used as positive control in some experiments, to estimate potential efect maxima.

#### *DDOST KD reduces proliferation and viability in PDAC cells*

A cell growth assay over 72 h showed a DDOST KD dependent reduction in proliferation in both cell lines, BXPC-3 and PA-TU-8988T, ranging from 20 to 22% (*P*=0.03 and *P*=0.04, respectively, Fig. [4A](#page-5-0)–C). Furthermore, detection of the cellular ATP-level indicated a reduced viability of 19–22% in both cell lines afer DDOST



<span id="page-3-0"></span>**Figure 2.** Fold change (FC) of total proteins and phosphopeptides afer DDOST KD in PA-TU-8988T cell line. (**A**) Western blot analysis of DDOST expression afer DDOST KD. β-Actin was used as loading control. (**B**, **C**) Quantifcation of rel. RNA expression and rel. protein expression levels of DDOST afer KD (\*\**P*<0.01, \*\*\**P*<0.001; unpaired *t*-test). (**D**, **F**) Volcano plot of protein and phosphopeptide log2-FC. Highlighted proteins and phosphopeptides cutoff FDR < 0.05 (n = 5; ROTS-test). (**E**, **G**) Bar chart of protein and phosphopeptide log2-FC. Upregulated proteins and phosphopeptides in red, downregulated in blue.

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<span id="page-4-0"></span>**Figure 3.** Interactions and correlations of 26 proteins identifed as DEPs. (**A**) PPI network consisting of 26 nodes and 67 edges from STRING database (PPI enrichment *P*=2.83× 10−4). (**B**) Spearman correlation analysis of mRNA levels (TCGA pancreatic adenocarcinoma) comparing *DDOST* with all identifed DEPs (*P*<1.00× 10−4; n=179). (**C**) Functional enrichment analysis as implemented in the GAD[O23](#page-11-7) webserver (negative regulation of apoptotic process: *P*=2.54× 10−6; cell proliferation: *P*=5.35× 10−4; cellular response to oxidative stress:  $P = 1.11 \times 10^{-3}$ ; cellular response to unfolded protein:  $P = 1.18 \times 10^{-3}$ ).



<span id="page-5-0"></span>**Figure 4.** Reduced proliferation and viability and induced ER stress afer DDOST KD in PDAC cell lines. (**A**) Growth curve of BXPC-3 cells afer DDOST KD. (**B**) Growth curve of PA-TU-8988T cells afer DDOST KD. (**C**) Quantifcation of proliferation assay 72 h afer DDOST KD and TM treatment. (**D**) Quantifcation of viability assay 72 h afer DDOST KD and TM treatment. (**E**) Immunofuorescence images of DDOST and CHOP afer DDOST KD and treatment with TM (scale  $bar = 50 \mu m$ ). (**F**) Quantification of CHOP rel. IF intensity after DDOST KD and treatment with TM. (G) Western blot analysis of DDOST KD efficiency. β-Actin was used as loading control. (\**P*<0.05, \*\**P*<0.01, \*\*\**P*<0.001; unpaired *t*-test).

KD ( $P = 0.05$  and  $P = 0.02$ , Fig. [4D](#page-5-0)). Treatment of siControl cells with 1  $\mu$ M TM as a positive control for OST complex inhibition, led to a decrease in proliferation, ranging from 31 to 71% ( $P = 0.03$  and  $P = 3.00 \times 10^{-4}$ , respectively, Fig. [4C](#page-5-0)) and decreased ATP-levels of 37–70% (*P*=0.03 and *P*=1.00× 10−4, respectively, Fig. [4](#page-5-0)D). Moreover, treatment of siDDOST cells with 1  $\mu$ M TM for 24 h after KD resulted in a 46-60% decrease in cell growth  $(P=6.10\times10^{-3}$  and  $P=1.30\times10^{-3}$ , respectively, Fig. [4C](#page-5-0)) in both, BXPC-3 and PA-TU-8988T. Additionally, treatment of siDDOST cells with 1 µM TM led to 61% decrease in ATP level in PA-TU-8988T (*P*=0.02, respectively, Fig. [4D](#page-5-0)) but not in BXPC-3. Tus, KD of DDOST reduces proliferation and cell viability in both tested cells lines, which is also observed for the OST complex inhibitor TM.

# *DDOST KD induces ER stress in PDAC cells*

To examine the efects of DDOST KD on ER-related cell stress, protein level of the ER stress regulator CHOP was detected using an immunofuorescence assay. In BXPC-3, CHOP level was 77% increased and in PA-TU-8988T 19% increased afer 48 h of DDOST KD (*P*=0.03, *P*=0.04, respectively, Fig. [4](#page-5-0)E,F). Treatment of siControl cells with 1 µM TM led to a 54% increase of CHOP level in PA-TU-8988T ( $\overline{P}$ =5.70 × 10<sup>-3</sup>, respectively, Fig. [4E](#page-5-0),F) but not in BXPC-3. Additionally, treatment of siDDOST cells with 1 µM TM led to 34% increased CHOP level in PA-TU-8988T (P=0.03, respectively, Fig. [4E](#page-5-0),F) but not in BXPC-3. The ER stress level was increased in both tested cell lines after DDOST KD or TM treatment. Efficiency of DDOST KD was validated by western blot analysis (Fig. [4](#page-5-0)G).

#### *DDOST KD induces oxidative stress in PDAC cells*

ROS formation assay was performed to assess the potential efects of DDOST KD on oxidative stress levels in PDAC cells. Therefore, cells were incubated with H<sub>2</sub>DCF-DA acting as indicator of intracellular ROS by its oxidized and fuorescent form DCF. Fluorescence intensity was determined 48 h post KD transfection using fow cytometry analysis. DCF intensity was increased 17% in BXPC-3 and 23% in PA-TU-8988T cell lines afer DDOST KD (*P*=0.04, *P*=0.01, respectively, Fig. [5A](#page-6-0),B). Further, treatment of siControl cells with 1 µM TM led to 28% increased DCF intensity in PA-TU-8988T ( $P=0.02$ , respectively, Fig. [5](#page-6-0)B), but not in BXPC-3 cell line. Thus, the oxidative stress level was increased after KD DDOST and partially after TM treatment.



<span id="page-6-0"></span>**Figure 5.** Induced ROS formation and Apoptosis afer DDOST KD in PDAC cells. (**A**) Flow cytometry assay of ROS formation by DCF detection afer DDOST KD. (**B**) Quantifcation of mean rel. DCF intensity afer DDOST KD and treatment with TM. (**C**) Flow cytometry assay of FITC-Annexin V and PI staining afer DDOST KD. (**D**) Quantifcation of FITC-Annexin V and PI positive cells afer DDOST KD and treatment with TM. (\**P*<0.05, \*\*\**P*<0.001; unpaired *t*-test). Western blot analysis of DDOST KD efciency shown in Fig. [4G](#page-5-0).

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#### *DDOST KD induces apoptosis in PDAC cells*

To examine apoptotic efects of DDOST KD, PDAC cell lines were stained with Propidium Iodide (PI) and Annexin V to determine apoptotic activation using fow cytometry analysis 48 h post transfection. PI and Annexin V level were signifcantly increased by 62% in PA-TU-8988T but not signifcantly increased by 28% in BXPC-3 cells after DDOST KD ( $P = 0.01$ ,  $P = 0.05$ , respectively, Fig. [5C](#page-6-0),D). Further, treatment of siControl cells with 1 µM TM led to threefold increased PI and Annexin V level in PA-TU-8988T cells (*P*=2.00× 10−4, respectively, Fig. [5D](#page-6-0)). Tus, apoptosis was increased afer DDOST KD or TM treatment in PA-TU-8988T but not in BXPC-3 cell line.

#### **Discussion**

The pancreatic gland has a high secretory capacity and therefore requires a high level of protein translation, post-translational modification and secretion. The OST complex is essential for *N*-linked glycosylation, one of the most common protein modifications, and has been implicated in ER stress-induced cell death in PDAC<sup>13[,24](#page-11-8)</sup>. Moreover, it has been shown that *N*-linked glycosylation of critical proteins is essential for tumorigenesis, pro-liferation and metastasis by maintaining cell homeostasis<sup>[9,](#page-10-13)[12,](#page-10-9)25-[27](#page-11-10)</sup>.

The assembly and stability of the OST complex requires the subunit  $DDOST^{28}$ , which has been correlated with immune infiltration, metastasis and prognosis in several types of cancer<sup>[16,](#page-11-0)[17,](#page-11-1)29</sup>. Additionally, data from a proteomic study suggested that DDOST function is particularly relevant in the pancreas, due to its tissue-specifc expression<sup>20</sup>. However, no association with pancreatic cancer has been reported so far. As there are limited therapeutic tools for PDAC, new insights into relevant processes of PDAC development may contribute to the understanding of tumorigenesis and thereby help to open novel diagnostic and therapeutic avenues. The present study aims to determine how DDOST may afect PDAC cellular phenotypes. We performed KD of DDOST in human PDAC cell lines and used a mass-spectrometry based assay to detect DEPs. Afer matching these results to biological processes, they were phenotypically verifed. We could experimentally validate our fndings in phenotypic assays, fnding a signifcant regulation of proliferation, oxidative stress, and apoptosis by DDOST KD.

Approximately half of human proteins are glycoproteins, the majority of which are *N*-linked glycosylate[d30](#page-11-13). Protein *N*-linked glycosylation has been linked to skin cancer<sup>31</sup>, along with its crucial role in many cellular activities, including protein folding, stability and interaction<sup>[32](#page-11-15)</sup>. A recent study reported that the expression level of the *amino acid transport complex* was signifcantly coregulated in head and neck squamous cell carcinoma tissues and cell lines<sup>[33](#page-11-16)</sup>. An upregulation was associated with poor survival of oral squamous cell carcinoma patients. Afer KD of SLC3A2 reduced migration, invasion and proliferation but increased apoptosis in cancer cell lines was observed<sup>34</sup>. These results are consistent with our finding of reduced SLC3A2 expression together with reduced proliferation and increased apoptosis afer KD of DDOST. In addition, we found that SLC7A5 expression was reduced afer DDOST KD, and both SLC3A2 and SLC7A5 have been annotated to the *amino acid transport complex* by GSEA.

To analyze the relationships of the identifed DEPs, we used the STRING database obtaining a PPI network including all signifcant regulated hits with a wide variety of interactions, of which one was the OST complex cluster with three identifed proteins DDOST, RPN2 and STT3B. Interestingly, CALU, directly interacting with DDOST and RPN2, is known to be highly expressed in tumor cells and therefore might play a crucial role in cancer progression and the induction of epithelial-to-mesenchymal transition<sup>35</sup>. Furthermore, the protein with the most edges to other DEPs was YWHAZ, a central hub protein for many signal pathways frequently upregulated in multiple types of cancers which is associated with cell growth, apoptosis, migration and invasion<sup>36</sup>. Another identifed key regulator was MAPK1, which is known to regulate cell functions including proliferation, gene expression, differentiation, mitosis, cell survival, and apoptosis<sup>[37](#page-11-20)</sup>. All 30 DEPs were significantly correlated with DDOST in 179 PAAD tumor tissue samples, among which 22 were strong correlations, including RPN2, SERBP1, CALU, STT3B, YWHAZ and MAPK1. The RNA-binding protein SERBP1 has been shown to play an important role in apoptosis and metabolic processes through post-transcriptional regulation of gene transcription and alternative splicing in HeLa cells, and to worsen the prognosis for PDAC surviva[l38](#page-11-21).

We found a signifcant association of the identifed DEPs with carcinogenesis related pathways such as *negative regulation of apoptotic process* and *cell proliferation*, *cellular response to oxidative stress*, *response to endoplasmic reticulum stress* and *response to unfolded protein.* Previous studies have reported that dysregulation of the oxidative stress response play important roles in carcinogenesis and tumor progression by exploiting the respective response mechanisms under stress conditions<sup>[39](#page-11-22),[40](#page-11-23)</sup>. To phenotypically validate our findings, we focused on the key biological processes annotated by GO analysis of the identifed DEPs that are important for tumor development and further investigated them experimentally in vitro. In our study, we show that KD of DDOST by siRNA led to reduced proliferation rates and viability, as well as increased ER stress, ROS formation and apoptosis in PDAC cells. Tis is consistent with the fnding that a mutation of DDOST causes a general defect in *N*-linked glycosyla-tion leading to ER stress in gastric cancer cells<sup>[27,](#page-11-10)41</sup>. A recent review, based on the effects of several therapeutics with the potential to increase ER stress, hypothesized that increased ER stress in pancreatic cancer activates the UPR and leads to ER-induced apoptosis via CHOP<sup>42</sup>. Additionally, increased levels of CHOP promoted ROSinduced apoptosis by mediating between ER stress signaling and ROS formation $43,44$  $43,44$ . These reports are consistent with our fnding that both ROS formation and apoptosis levels were increased afer DDOST downregulation in PDAC cells.

Based on these data, we propose that DDOST has a tumor-promoting capacity in PDAC cells by maintaining ER homeostasis and thereby suppressing ROS formation and apoptosis. The proteomics inferred pathways could be functionally validated in the *KRAS*-mutant cell line PA-TU-8988T, yet in the *KRAS*-wild type cell line BXPC-3 we found similar efect however no signifcant impact on apoptosis. We have to note, that future, deeper studies are required to follow this initial observation. We detected 28 proteins, which rely on the expression of DDOST. However, the specifc regulation of DDOST on non-glycosylated proteins requires further research. For this reason, the need for a glycosylation assay is a limitation since we cannot explain how DDOST afects non-glycosylated proteins or protein phosphorylation. An accumulation of un-glycosylated proteins may induce the UPR, explaining the observed efects. On the other hand, while MS analysis has allowed us to relate several proteins to DDOST, we suspect that several regulated genes were not identifed by the mass spectrometric approach. Moreover, further studies are needed to clarify the exact relationship between DDOST and the candidate interaction partners identifed in this study.

In conclusion, our in vitro experiments demonstrated that downregulation of DDOST induces ER stress leading to enhanced ROS formation and apoptosis, as well as reduced proliferation and cell viability in two human pancreatic cancer cell lines. Further, this study identifed DEPs, which are related to DDOST and may be involved in pancreatic carcinogenesis. A total of 30 regulated proteins and phosphopeptides were identifed and may be regarded as diagnostic biomarkers for PDAC. However, further studies are needed to elucidate the biological function of these proteins in PDAC.

# **Methods**

#### **Cell culture**

PA-TU-8988T (RRID: CVCL-1847) and PANC-1 cells (RRID: CVCL-0480) were maintained in 90% Dulbecco's MEM (Thermo Fisher Scientific), supplemented with 10% FBS, at 37 °C in humidified 5% CO<sub>2</sub>. BXPC-3 cells (RRID: CVCL\_0186) were maintained in 90% RPMI 1640 (Thermo Fisher Scientific), supplemented 10% FBS, at 37 °C in humidified 5% CO<sub>2</sub>. 24 h post-transfection, cells were washed in PBS and incubated with low serum (1%) for 5 h before treatment with 1 µM TM for 24 h. Cell lines were received from the group of Prof. Seuferlein (Ulm, Germany), and identity verifed by STR-analysis.

# **Transfection of siRNA**

PA-TU-8988T or BXPC-3 cells were transfected using Invitrogen Lipofectamine RNAiMAX Transfection Reagent (Thermo Fisher Scientific), according to manufacturer's instructions. Transfection of Accell non-targeting siRNA (Dharmacon) and self-designed siDDOST was performed at a fnal concentration of 50 nM. First pool of DDOST siRNA consisted of sequences CAACGUGGAGACCAUCAGUGtt and CAUCAACGUGGAGAC CAUCtt. Second pool of DDOST siRNA consisted of sequences GACAAGCCUAUCACCCAGUAUtt, AUACAG UGUUCAGUUCAAGtt, CAUCAACGUGGAGACCAUCtt, GUAUGGUGUAUUCCAGUUUAAtt, GUGAUC CAGCAGCUCUCAAAUtt.

#### **RNA quantifcation**

Total RNA of lysed cells was isolated and purifed using the NucleoSpin RNA kit (Macherey–Nagel) according to the manufacturers protocol. Equal amounts of RNA were reverse transcribed into cDNA using the Omniscript RT Kit (Qiagen) according to the manufacturers protocol. The mRNA expression was detected using quantitative real-time polymerase chain reaction (qRT-PCR) with the Luna Universal SYBR Green Supermix (NEB) via an Realtime PCR system (Applied Biosystems) and the corresponding primers for *DDOST* forward and reverse primer sequences were 5′TTGGTACCCTTCGGCAGGAGGAGGAA 3′ and 5′AAAGGATCCTTTGAGGGC AACATCTCG 3'. The ribosomal protein *RPLP0* or human *B2M* was used as an endogenous control. All experiments were performed in triplicates and are displayed in  $\pm$  SD.

# **Western blot analysis**

Cells were lysed in RIPA lysis bufer (50 mM Tris–HCl (pH 7.5), 150 mM NaCl, 0.1% SDS, 1% sodium deoxycholate and 1% Triton X-100), supplemented with 4% Complete Protease-Inhibitor Cocktail (Roche) and 1% phosphatase inhibitor Mix I (Serva). Afer brief sonifcation, 20 µg of cell lysates were analyzed by SDS-PAGE (10% gels) and transferred onto PVDF membranes, followed by treatment with the appropriate primary antibodies against DDOST (HPA046841, Atlas Antibodies), β-Actin (A1978, Sigma-Aldrich) and the suitable peroxidase-conjugated secondary antibody (GE Healthcare). Target proteins were visualized using WesternBright Chemiluminescence Substrate Sirius system (Biozym). For reprobing, blots were stripped with Restore Western Blot Stripping Buffer (Thermo Scientific) before the addition of a new primary antibody. β-Actin antibody was used as loading control. Gels were scanned using INTAS Advanced fuorescence Imager and sofware ChemoStar version 0.4.21. Uncropped western blots, some cut prior to hybridization, are shown in Fig S2.

#### **Mass spectrometry**

#### *Sample preparation and TMT labeling*

Five biological replicates of 100 μl cell lysates (1 μg/μl) total protein were collected and further processed for liquid chromatography-tandem mass spectrometry (LC–MS/MS) analysis following an adapted flter-aided sample preparation (FASP) protocol<sup>45</sup>. The protein samples were reduced with 10 mM TCEP (8 M urea in 50 mM HEPES, pH 8.5) and subjected to centrifugation with 30-kDa cutof fltration units (Amicon). For alkylation, samples were incubated in the dark with 50 mM iodoacetamide in 8 M urea, 50 mM HEPES, pH 8.5, centrifuged and washed before trypsinization with 2 µg trypsin (Promega) in 50 mM HEPES, pH 8.5 at 37 °C overnight. For quantitation, tryptic peptides were labeled using the amine-reactive TMT10plex Isobaric Label Reagent Set (Thermo Fisher Scientific) following the manufacturer's instructions.

#### *Phosphopeptide enrichment*

For phosphopeptide enrichment analysis, 980 µl of labeled peptide samples (see above) were purifed using a high-select TiO<sub>2</sub> phosphopeptide enrichment kit (Thermo Fisher Scientific) according to manufacturer's protocol.

#### *LC–MS/MS analysis*

Peptide solutions were analyzed by LC–MS/MS via the Ultimate 3000 RSLC nano-HPLC system coupled to an Orbitrap Fusion mass spectrometer with an EASY-Spray ion source (Thermo Fisher Scientific). Samples were loaded on reversed-phase (RP) C18 pre-column (Acclaim PepMap, 300 μm × 5 mm, 5 μm, 100 Å, Thermo Fisher Scientific), samples were washed with 0.1% TFA before the peptides were separated on a 50-cm µPAC C18 separation column (PharmaFluidics). Peptides were eluted with a linear 360-min gradient ranging from 3 to 35% (v/v) acetonitrile containing 0.1% formic acid at a fow rate of 300 nL/min. For data-dependent acquisition (DDA), MS/MS experiments were performed for analyzing enriched phosphorylated peptides, while MS<sup>3</sup> experiments were used for TMT-labeled peptides. For MS/MS, high energy collision-induced dissociation (HCD) was applied using normalized collision energies (NCE) of 27, 28 and 38%, as well as collision-induced dissociation (CID) using 35% NCE. Te high-resolution full MS scans were followed by high-resolution product ion scans in the orbitrap and low-resolution scans in the linear ion trap. For  $\mathrm{M}S^3$  experiments, CID was applied at 35% NCE. The high-resolution product ion scans were acquired in the orbitrap after simultaneous selection and fragmentation (HCD at 55% NCE) of the 10 most intense MS/MS fragment ions. For both modes, MS/MS and MS<sup>3</sup>, dynamic exclusion was enabled. Data acquisition was performed via the Xcalibur version 4.3 software (Thermo Fisher Scientific).

#### *MS data analysis*

For peptide identifcation and quantifcation, LC–MS/MS data were searched against the Swissprot database (taxonomy *Homo sapiens*, 04/23, 20,332 entries) using the SequestHT database search algorithm with Proteome Discoverer (version 2.4; Thermo Fisher Scientific). A maximum mass deviation of 10 ppm was applied for precursor ions while for product ions, max. 0.6 Da (linear ion trap data) and 0.02 Da (orbitrap data) were allowed. Oxidation of Met, acetylation of protein N-termini, and phosphorylation of Ser, Thr, and Tyr were set as variable modifcations. Carbamidomethylation of cysteines and modifcations of peptide N-termini and Lys by the TMT label were included as fxed modifcations. A maximum of two missed cleavage sites were considered for peptides. Quantifcation was performed using the TMT reporter ion abundances derived from HCD spectra, reporter ion intensities of protein unique and razor peptides were added to give protein abundances.

For both, protein and peptide level analysis, instances with missing quantifcation for all replicates in both conditions were fltered out. For imputation of missing data, the K-nearest neighbors (kNN) algorithm using the 'impute.knn' function from the 'impute' R package was applied in DDOST KD and control KD experiments separately $46,47$ .

Non-unique phosphopeptides and peptides with ambiguous phosphorylation sites were fltered out before phosphopeptide quantitation was performed. To correct for abundance diferences at the protein level, phosphopeptides were normalized afer log2 transformation by subtracting the corresponding log2 protein abundance for each replicate/condition, where given. To simplify data analysis, peptides indicating equal phosphorylation sites were merged by summing their reporter ion intensities.

#### **Proliferation assay**

Cell proliferation was determined by cell counting using the CASY counter system (Omni Life Science). For KD-experiments cells were seeded in 24-well plates at a density of 25,000 cells / well in triplicates for each time point. Cells were harvested 24 h, 48 h and 72 h afer seeding and absolute cell count was determined.

#### **ATP concentration assay**

ATP concentration was measured with the CellTiter-Glo Luminescent Cell Viability Assay (Promega) according to the manufacturer's instructions. Cells were seeded in 96-well plates at a density of 5,000 cells / well with fve replicates and incubated 48 h post transfection at 37 °C. Finally, the luminescence of each well was measured by Luminoskan Ascent (Thermo Scientific).

#### **Immune fuorescence ER‑stress**

PDAC cells were grown on polylysine-coated coverslips in 24 well plates at a density of 50,000 cells / well and incubated 24 h post transfection at 37 °C in humidified 5% CO<sub>2</sub>. As positive control for ER-stress, 1  $\mu$ M of TM was added. Afer incubation, cells were fxed with 4% paraformaldehyde for 15 min and permeabilized with 0.3% Triton X-100 (Sigma-Aldrich) in PBS for 10 min. Subsequently, cells were blocked with 5% goat serum (Thermo Fisher Scientific) in PBS for 1 h. Afterwards, cells were incubated with the primary antibodies for DDOST (HPA046841, Atlas Antibodies) and CHOP (2895, Cell Signaling) at 4 °C overnight, followed by incubation with Alexa Flour 488 and 594 labelled secondary antibodies (Thermo Fisher Scientific). Then, cells were mounted using ProLong Gold with DAPI (Thermo Fisher Scientific) and visualized using a wide-field fluorescence microscope (BZ-X810, Keyence). The area of CHOP-positive cells was quantified using ImageJ software. Three randomly selected images from each culture condition were analyzed.

#### **Intracellular ROS assay by flow cytometry**

PDAC cells were grown in 12 well plates at a density of 100,000 cells / well and incubated 24 h post transfection at 37 °C in humidified 5% CO<sub>2</sub>. Intracellular reactive oxygen species (ROS) were detected using H<sub>2</sub>DCF-DA (HY-D0940, MedChemExpress). Briefy, cells were incubated with H2DCF-DA for 2 h at 37 °C in humidifed 5% CO2. Afer washing with PBS, cells were incubated with propidium iodide (PI) for another 15 min and subsequently analyzed via fow cytometry (LSRFortessa, BD Bioscience; FlowJo Sofware (v7.6.5), BD Bioscience).

#### Apoptosis assay by flow cytometry

PDAC cells were grown in 12 well plates at a density of 100,000 cells/well and incubated 48 h post transfection at 37 °C in humidified 5% CO<sub>2</sub>. After harvest, cells where resuspended in binding buffer and incubated with BD AnnexinV-FITC (556420, fsher scientifc) and PI solution (P3566, Invitrogen) according to the manufacturer's instructions. Subsequently, the cells were analyzed via fow cytometry (LSRFortessa, BD Bioscience; FlowJo Software (v7.6.5), BD Bioscience).

#### **Statistical analysis**

LC–MS/MS protein- and peptide-level data were analyzed using the reproducibility-optimized test statistic (ROTS) test implemented in the R package ROTS, a non-parametric test<sup>[48](#page-11-31)</sup>. Before performing the ROTS test, 1 was added to all abundances and the data were log2-transformed. Data gathered by western blot method, PCR and phenotypical assays are expressed as the mean±SD. Statistical analysis was performed using Graph-Pad Prism (version 9.4.1). Diferences were calculated using unpaired, two-tailed student's t-test and considered statistically signifcant when *P*≤0.05. *p*-Values of \* *P*≤0.05, \*\* *P*≤0.01, or \*\*\* *P*≤0.001 are indicated in fgures. Spearman correlation analysis was performed on 03/27/2023, using GEPIA 2 analysis tool, based on the TCGA Tumor dataset of PAAD (pancreatic adenocarcinoma) cancer typ[e49.](#page-11-32) *ρ*-results were normalized to *RPLP0* and interpreted according to Cohen (1988). Strong correlation: *ρ*≥0.5, medium correlation: *ρ*≥0.3, weak correlation:  $\rho \ge 0.1$  (n = 179).

#### **PPI and GADO network construction**

Protein–protein interaction (PPI) clusters were created using the STRING database version 11.5 on 03/25/2023 [\(https://string-db.org/cgi/input.pl\)](https://string-db.org/cgi/input.pl). Tereby, known and predicted protein–protein association data are collected and integrated. Both physical and indirect, functional interactions are associated as long as they are specifc and biologically meaningful<sup>50</sup>. The STRING database was used to create the PPI network of DDOST with a minimum interaction score of 0.15 in the organism of homo sapiens including the whole genome as statistical background. The interaction predictions were obtained from databases, experiments, gene neighborhood, text mining and co-expression. The enrichment function of the GADO tool<sup>[23](#page-11-7)</sup> [\(https://www.genenetwork.nl/](https://www.genenetwork.nl/)) which leverages gene co-regulation to improve prediction of pathway membership, was used to identify signifcantly enriched pathways in the set of 26 identifed DEPs (Database: GO\_P, Test type: wilcoxon, gene set analysis results downloaded: 2024-05-13).

# **Data availability**

Proteomics data generated in this work are available via PRIDE (PRoteomics IDEntifcation Database, [https://](https://www.ebi.ac.uk/pride/) [www.ebi.ac.uk/pride/\)](https://www.ebi.ac.uk/pride/) using the identifer PXD047441.

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#### **Author contributions**

Conceptualization, R.B., H.L., G.P., P.M. and J.R.; methodology, R.B., H.L., C.I. and A.S.; validation, R.B. and H.L.; formal analysis, A.S., R.B. and H.L.; investigation, R.B.; resources, P.M., J.R., H.L., C.I. and A.S.; data curation, R.B. and H.L.; writing—original draf preparation, R.B.; writing—review and editing, H.L. and J.R.; visualization, R.B.; supervision, H.L., G.P.; project administration, R.B., H.L., P.M. and J.R.; funding acquisition, R.B., N.H. and J.R.; All authors have read and agreed to the published version of the manuscript.

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## **Competing interests**

The authors declare no competing interests.

#### **Additional information**

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