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ABSTRACT
Tryptophan (Trp) metabolism is an important target in immuno-oncology as it represents a powerful immunosuppressive mechanism hijacked by tumors for protection against immune destruction. However, it remains unclear how tumor cells can proliferate while degrading the essential amino acid Trp. Trp is incorporated into proteins after it is attached to its tRNA by tryptophanyl-tRNA synthetases. The balance between these enzymes will determine whether Trp is used for protein synthesis or is degraded. In humans, expression of the Trp-degrading enzymes indoleamine-2,3-dioxygenase-1 (IDO1) and tryptophan-2,3-dioxygenase (TDO2) was positively associated with the expression of the Trp-degrading enzyme tryptophanyl-tRNA synthetase WARS. One mechanism underlying the association between IDO1 and WARS identified in this study is their joint induction by IFNα released from tumor-infiltrating T cells. Moreover, we show here that IDO1- and TDO2-mediated Trp deprivation upregulated WARS expression by activating the general control non-derepressible-2 (GCN2) kinase, leading to phosphorylation of the eukaryotic translation initiation factor 2α (eIF2α) and induction of activating transcription factor 4 (ATF4) expression.

KEYWORDS
Indoleamine-2, 3-dioxygenase; tryptophan-2,3-dioxygenase; tumor; proliferation; cancer metabolism; tryptophan; tRNA synthetase; immunosuppression; nutrients; starvation; immunosurveillance; inflammation and cancer

INTRODUCTION
Tryptophan (Trp) is the least abundant amino acid of the standard genetic code. As an essential amino acid it cannot be synthesized in humans but has to be taken up with the diet. In addition to serving as a building block for proteins, Trp degradation to kynurenine (Kyn) and downstream metabolites has evolved as a powerful immunoregulatory mechanism. In humans, Trp degradation is catalyzed by three isoenzymes, indoleamine-2,3-dioxygenase-1 and -2 (IDO1, 2) and tryptophan-2,3-dioxygenase (TDO2). While IDO1 and TDO2 are recognized as major Trp-degrading enzymes, the role of IDO2 is less clear as it rather inefficiently catalyzes the conversion of Trp to Kyn. IDO1 is highly induced almost ubiquitously by pro-inflammatory stimuli such as interferon gamma (IFNγ), while TDO2 is constitutively expressed in the liver, where it regulates systemic Trp levels.

Trp is a key nutrient for immune cells in two ways: Trp catabolites promote the differentiation of regulatory T cells (Treg) and induce apoptosis of T cells. On the other hand, Trp depletion has been implicated in the proliferation arrest of CD8+ T cells by the accumulation of uncharged transfer RNA (tRNA) and subsequent activation of the general control non-derepressible-2 (GCN2) kinase.
pathway\textsuperscript{11,12}, while Gcn2 in T cells has recently been shown to be dispensable for the suppression of antitumor immune responses in experimental melanomas\textsuperscript{13}.

Trp degrading enzymes are expressed in many cancers. IDO1, for instance, is expressed in about 58\% of human cancers\textsuperscript{14}, and also TDO2 is present in multiple cancer entities including melanoma, ovarian carcinoma, hepatic carcinoma, non-small cell lung cancer, renal cell carcinoma, bladder cancer, breast cancer and glioblastoma\textsuperscript{15–17}. As the degradation of the essential amino acid Trp is a key mechanism for immune evasion in many tumors, the question arises how the tumor cells concomitantly sustain their capacity for protein synthesis and excessive proliferation. The cytoplasmic tryptophanyl-tRNA synthetase (TrpRS) WARS and the mitochondrial TrpRS WARS2 attack Trp to their tRNAs, which is required for the incorporation of Trp into proteins. We hypothesized that increased expression of TrpRS may enable the cancer cells to incorporate Trp into their proteins despite low Trp levels. We therefore investigated the regulation of the TrpRS WARS and WARS2 upon Trp degradation and their balance with the Trp catabolizing enzymes.

\textbf{Results}

\textbf{IDO1 and WARS are jointly induced by IFNγ produced by tumor infiltrating T cells in breast cancer, colon cancer and B cell lymphoma}

To investigate if a relationship exists between the expression of IDO1 and the two TrpRS WARS and WARS2 we analyzed gene expression data of breast cancer, colon carcinoma and B cell lymphoma, as these neoplasms have been reported to express IDO1\textsuperscript{18}. We observed a strong positive correlation between IDO1 and WARS but not WARS2 (Figure 1A). T cell-specific genes such as CD2 and CD3D also strongly correlated with WARS and IDO1, suggesting that their expression is induced by factors released by T cells (Figure 1B, Fig. S1A, and B). Furthermore, IDO1 and WARS positively correlated with the expression of IFNG as well as the IFNγ-induced genes STAT1 and IRF1\textsuperscript{19}, suggesting that IDO1 and WARS induction is mediated through IFNγ (Figure 1C, Fig. S1 C and D).

Indeed, supernatants of activated primary human T cells induced IDO1 and WARS mRNA and protein expression in breast cancer cells, while they did not increase WARS2 levels (Figure 1D). The induction of IDO1 and WARS by the supernatants of activated primary human T cells was abrogated by addition of an IFNγ blocking antibody (Figure 1D), confirming that IFNγ is the T cell factor inducing IDO1 and WARS. In keeping with this, also recombinant IFNγ induced IDO1 and WARS, but not WARS2 expression (Figure 1E).

\textbf{TDO2 and IDO1 activity upregulate WARS expression}

As TDO2 also degrades Trp in cancer cells, we next analyzed whether WARS or WARS2 gene expression correlated with TDO2. To explore if a relationship exists between the expression of TDO2 and the two TrpRS, we selected glioma, breast cancer, and ovarian carcinoma as cancer entities, which are known to express high TDO2 levels\textsuperscript{15–17}. Indeed TDO2 expression correlated with WARS but not WARS2 (Figure 2A and B), although the correlations were less strong than for IDO1 (Figure 1A). We next investigated whether the correlation between WARS and TDO2 is also mediated by joint induction through IFNy. However, our data did not support this hypothesis, as recombinant IFNy failed to induce TDO2 in two distinct glioblastoma cell lines (Figure 2C). We therefore tested whether WARS induction is mediated by TDO2 itself. TDO2 overexpression in LN229 glioblastoma cells lacking endogenous TDO2 (Figure 2D) decreased Trp and increased Kyn levels (Figure 2E), confirming that the overexpressed TDO2 efficiently degraded Trp. In line with our hypothesis also WARS expression was induced by TDO2 overexpression (Figure 2F), suggesting a causal relationship between TDO2 expression and WARS induction. In contrast, WARS2 was reduced in TDO2 overexpressing cells (Figure 2G).

As TDO2 degrades Trp, it would be likely that Trp degradation is responsible for WARS induction. To corroborate this we overexpressed IDO1 (Figure 2H), the other enzyme that degrades Trp to Kyn (Figure 2I). Similarly to TDO2 also IDO1 overexpression induced WARS (Figure 2J) but not WARS2 (Figure 2K). Taken together our data suggest that both IDO1 and TDO2 act upstream of WARS by inducing its expression.

\textbf{Trp depletion upregulates WARS expression}

IDO1 and TDO2 both degrade Trp to Kyn, leading to Trp deprivation and accumulation of Trp metabolites\textsuperscript{5}. Therefore, the question arises whether the accumulation of Trp metabolites or the depletion of Trp induces WARS. To this end we cultured A172 glioblastoma cells, which exhibit constitutive TDO2 activity\textsuperscript{16,17}, for 5 days in complete medium without or with additional Trp supplementation. Trp supplementation, a condition that promotes the accumulation of Trp metabolites, reduced WARS expression (Figure 3A), while not affecting WARS2 (Figure 3B). Conversely, Trp starvation induced WARS mRNA (Figure 3C) in cell lines with high (A172) and medium (LN18) TDO2 expression, high IDO1 expression (SKOV3) as well as in cells that do not express any Trp-degrading enzymes (LN229)\textsuperscript{16,20}. The increase in WARS mRNA upon Trp starvation also translated into increased WARS protein levels as assessed in LN229 glioblastoma cells. (Figure 3D). Similar to IDO1 overexpression (Figure 2K), also Trp starvation did not alter WARS2 levels (Figure 3E). Based on these results we conclude that the degradation of Trp induces WARS not through the accumulation of Trp metabolites but by depleting Trp.

In addition to attaching Trp to its specific tRNA, which occurs mainly in the cytoplasm, WARS is involved in cellular signaling processes in the nucleus or in the extracellular space\textsuperscript{21–24}. To investigate if Trp starvation affects WARS expression in specific cellular locations, we analyzed WARS protein expression in cytoplasmic and nuclear cell fractions (Figure 3F) as well as in cell supernatants (Figure 3G). In the cytoplasmic fraction WARS protein expression was enhanced in response to Trp starvation (Figure 3F). In contrast, in the nuclear fraction WARS expression was not altered by Trp starvation (Figure 3F). In cell supernatants of LN229 and A172...
Figure 1. IDO1 and WARS correlate with each other and are both associated with the expression of T cell markers and with IFNγ signaling.  
(A) Left: Correlation between IDO1 and WARS expression in breast cancer, colon cancer and B-cell lymphoma. Right: IDO1 and WARS2 expression in breast cancer, colon cancer and B-cell lymphoma do not correlate with each other \((n = 124 \text{ for breast cancer}, n = 355 \text{ for colon cancer}, n = 215 \text{ for lymphoma, Spearman’s rank cor} \text{relation})\).  
(B) WARS (red) and IDO1 (blue) expression are significantly correlated with the expression of the T cell markers CD3D and CD2, and  
(C) with the expression of IFNG, STAT1 and IRF1 in breast cancer \((n = 124, \text{ Spearman’s rank correlation})\).  
(D) IDO1, WARS and WARS2 mRNA levels measured by qRT-PCR and IDO1 and WARS protein measured by Western blot after treatment of the human breast cancer cell lines MCF7, BT-474 and MDA-MB-231 with supernatants of activated CD4 + T cells in the absence and presence of an IFNγ blocking antibody.  
(E) IDO1, WARS and WARS2 mRNA levels measured by qRT-PCR and IDO1 and WARS protein measured by Western blot after treatment of MCF7 cells with 1000 U/ml recombinant IFNγ. All data are expressed as mean ± s.e.m. Statistical significance is assumed at \(P < 0.05\) \((^* P < 0.05, ^{**} P < 0.01, ^{***} P < 0.001\)).
Figure 2. TDO2 and IDO1 activity upregulate WARS expression.

(A) Correlation between TDO2 and WARS expression in human glioma, breast cancer, and ovarian cancer. (B) TDO2 and WARS2 expression in glioma, breast cancer, and ovarian cancer do not correlate with each other \( (n = 50 \) for glioma, \( n = 90 \) for ovarian cancer, Spearman’s rank correlation). (C) Treatment of A172 and LN18 glioblastoma cells with 100 U/ml or 1000 U/ml IFN-\( \gamma \) did not alter TDO2 mRNA expression measured by qRT-PCR. (D) TDO2 mRNA expression in LN229 glioblastoma cells after overexpression of TDO2. (E) HPLC chromatograms showing Trp (top) and Kyn (bottom) measured in the supernatants of control-transduced (blue) and TDO2-overexpressing (red) LN229 glioblastoma cells. (F) WARS mRNA expression measured by qRT-PCR in control-transduced and TDO2-overexpressing LN229 cells. (H) IDO1 mRNA expression in HEK 293 cells after overexpression of IDO1. (J) HPLC chromatograms showing Trp (top) and Kyn (bottom) measured in the supernatants of control-transfected (blue) and IDO1-overexpressing (red) HEK 293 cells. All data are expressed as mean ± s.e.m. Statistical significance is assumed at \( P < 0.05 \) (*\( P < 0.05 \), **\( P < 0.01 \), ***\( P < 0.001 \)).
glioblastoma cells WARS protein expression was reduced in response to 48 h of Trp starvation (Figure 3G). Taken together, our results suggest that Trp starvation increases cytoplasmic WARS protein levels but not nuclear or extracellular WARS expression.

**Figure 3.** Trp depletion upregulates WARS expression.

(A) WARS mRNA expression measured by qRT-PCR in A172 glioblastoma cells, which exhibit constitutive TDO2 activity, cultured for 120 h in normal DMEM or with additional supplementation of 78 µM Trp after 72 h. (B) WARS2 mRNA expression measured by qRT-PCR in A172 glioblastoma cells under the conditions described in (A). (C) WARS mRNA expression measured by qRT-PCR in glioblastoma (A172, LN18, LN229) and ovarian carcinoma cells (SKOV-3) after 24 h of cultivation in medium containing 78 µM versus no Trp. (D) WARS protein levels in LN229 glioblastoma cells detected by Western blot after 48 h or 72 h of cultivation in medium containing 78 µM or no Trp. GAPDH served as loading control. (E) WARS2 mRNA expression measured by qRT-PCR was not altered by the conditions described in (C). (F) WARS protein levels in the cytoplasmic or nuclear fraction of LN229 glioblastoma cells detected by Western blot after 48 h of cultivation in medium containing 78 µM or no Trp. GAPDH served as loading control for the cytoplasmic fraction, lamin A/C as loading control for the nuclear fraction. (G) WARS protein concentrations measured by ELISA in the supernatants of LN229 and A172 glioblastoma cells cultured for 48 h in the presence or absence of Trp. All data are expressed as mean ± s.e.m. Statistical significance is assumed at *P* < 0.05, **P** < 0.01, ***P*** < 0.001.

**GCN2-pelF2a-ATF4 signaling mediates the upregulation of WARS in response to trp depletion**

As Trp depletion mediates WARS induction and is known to activate GCN2, we next asked whether GCN2 mediates the
upregulation of WARS. For this purpose, GCN2 was knocked down in LN229 glioblastoma cells that were cultured with or without Trp (Figure 4A). GCN2 knockdown inhibited WARS induction by Trp deprivation on both mRNA (Figure 4B) and protein (Figure 4C) level. However, as expected it did not affect WARS2 (Figure 4D). Similar results were obtained in Gcn2 knockout mouse embryonic fibroblasts (MEFs) (Figure 4E-H). These results suggest that GCN2 mediates the induction of WARS in response to Trp deprivation.

GCN2 is activated by sensing of uncharged tRNA and therefore should not be specific for Trp starvation. In keeping with this, depletion of any essential amino acid resulted in an induction of WARS mRNA, albeit to different levels with depletion of Trp, valine and phenylalanine being the strongest inducers of WARS (Figure 4I).

To further elucidate the downstream effects of GCN2 activation we next set out to establish whether Trp starvations lead to phosphorylation of the translation initiation factor eIF2α as GCN2 is known to inhibit eIF2α by phosphorylation. Indeed, Trp starvation enhanced eIF2α phosphorylation at serine 51 (Figure 4J). To investigate whether eIF2α phosphorylation is required for WARS induction by Trp starvation, we used MEFs that express either wildtype eIF2α (SS) or a version in which serine 51 is mutated to an alanine (AA) and cannot be phosphorylated by Gcn2 (Figure 4K). Trp-starved AA-MEFs showed reduced WARS expression, as compared to SS-MEFs, indicating that eIF2α phosphorylation is required for the induction of WARS upon Trp starvation (Figure 4K).

eIF2α phosphorylation enhances translation and transcription of ATF4. In line, ATF4 protein (Figure 4L) and ATF4 mRNA (Fig. S2) levels increased upon Trp starvation. Importantly, knockdown of ATF4 in LN229 cells (Fig. S2) impaired WARS induction by Trp starvation (Figure 4M). Hence, ATF4 mediates enhanced WARS expression in Trp-deprived cells. In agreement, WARS and ATF4 levels positively correlated in human malignant gliomas (Figure 4N).

As ATF4 has been reported to regulate the transcription of many tRNA synthetases, we next compared the expression of WARS to that of all other tRNA synthetases in U87-MG glioblastoma cells that were Trp starved for 24 h. Trp starvation most strongly induced WARS mRNA expression (2.6 fold; Figure 4O). In addition, 7 other tRNA synthetases (glycyl-tRNA synthetase, GARS; cysteinyl-tRNA synthetase, CARS; alanyl-tRNA synthetase, AARS; methionyl-tRNA synthetase, MARS; seryl-tRNA synthetase, SARS; tyrosyl-tRNA synthetase, YARS and glutamyl-prolyl-tRNA synthetase, EPRS) were upregulated more than 1.5 fold. All of these tRNA synthetases are expressed in the cytoplasm, suggesting that – as already observed for WARS and WARS2 – the cytoplasmic and not the mitochondrial tRNA synthetases are primarily regulated though amino acid limitation.

Taken together, our results indicate that Trp starvation upregulates WARS expression through the Gcn2-eIF2α-ATF4 axis.

**Gcn2 protects cells against the effects of Trp shortage and enables an optimal utilization of Trp when it is replenished**

Next, we aimed to assess the effect of the observed WARS upregulation on the proliferation and survival of Trp-starved cancer cells. As we wanted to investigate the impact of the upregulation of WARS and not the general effect of WARS on cell proliferation and survival, we did not knockdown WARS, but analyzed how GCN2, which is required for WARS upregulation, modulates the cellular response to Trp starvation and replenishment. We reasoned that if the upregulation of WARS is protective against Trp depletion then GCN2 should also protect cells against Trp depletion. To test if GCN2 indeed confers an advantage on cells coping with Trp shortage, we analyzed the proliferation of wt and Gcn2 -/- MEFs under Trp-free conditions and in response to Trp replenishment after 24 h of Trp starvation. At 24 h of Trp starvation wt and Gcn2 -/- MEFs showed similar proliferation (Figure 5A). However, after that, the wt MEFs slowly proliferated further, whereas the Gcn2 -/- MEFs showed a strong decrease in proliferation (Figure 5A), indicated by a negative slope (1/h) (Figure 5B). Re-addition of Trp increased the proliferation of both wt and Gcn2 -/- MEFs, however, proliferation of Gcn2 -/- MEFS only recovered to levels similar to those of Trp-deprived wt cells (Figure 5A and B). Therefore, GCN2 seems to protect cells against the effects of Trp starvation and enables them to quickly make use of Trp when it is replenished.

**Trp shortage channels trp towards WARS and protein synthesis**

Our results presented so far demonstrate that IDO1 and TDO2 act upstream of WARS (Figure 6A). As IDO1 and WARS are induced in parallel by IFNγ (Figure 6A), IFNγ and Trp deprivation might have additive effects on WARS expression. To test this, we stimulated LN18 glioblastoma cells with IFNγ, deprived them of Trp or used a combination of both (Figure 6B). In support of our hypothesis, the combination of IFNγ with Trp deprivation enhanced WARS mRNA expression more strongly than either treatment alone (Figure 6B).

As WARS is necessary for the incorporation of Trp into proteins, we propose that WARS induction in response to Trp depletion channels Trp into protein synthesis (Figure 6A). In this scenario WARS and the Trp-metabolizing enzymes compete for Trp and the balance of these enzymes will determine whether Trp is used for protein synthesis or is converted to other metabolites. Computational modelling provides a means to quantitatively analyze metabolite usage by different pathways. To obtain an overview of the fate of Trp under conditions of Trp deficiency, we integrated gene expression data of U87-MG glioblastoma cells under Trp sufficiency or deprivation, into an extended version of a previously published mathematical model of Trp metabolism that is based on existing kinetic data for the enzymatic conversions and transporters. In line with the previously described upregulation of amino acid transporters in response to Trp deprivation, the model predicted increased flux of Trp into the cells (Figure 6C). Kyn is transported by some of the same antiporters as Trp. Therefore, the increase of these antiporters also enhanced flux of Kyn out of the cells resulting in reduced flux down the Kyn pathway (Figure 6C). Most prominently, Trp deficiency shifted Trp flux towards WARS and thus protein synthesis (Figure 6C), supporting our
Figure 4. GCN2-peIF2a-ATF4 signaling mediates the upregulation of WARS in response to Trp depletion.

(A) GCN2 mRNA expression measured by qRT-PCR in LN229 cells after knockdown of GCN2 by siRNA cultured in the absence and presence of 78 µM Trp for 24 h. (B) WARS mRNA expression measured by qRT-PCR and (C) WARS and GCN2 protein expression detected by Western blot under the conditions described in (A). GAPDH served as loading control. (D) WARS2 mRNA expression measured by qRT-PCR under the conditions described in (A). (E) Gcn2 mRNA expression in wildtype (wt) and Gcn2−/− MEFs cultured in the absence and presence of 78 µM Trp for 24 h. (F) Wars mRNA expression measured by qRT-PCR and (G) WARS and GCN2 protein expression detected by Western blot under the conditions described in (E). Tubulin served as loading control. (H) Wars2 mRNA expression measured by qRT-PCR under the conditions described in (E). (I) WARS mRNA expression measured by qRT-PCR in full DMEM medium (DMEM), in amino acid-free DMEM supplemented with all amino acids (+ all AA) and in amino acid-free DMEM supplemented with all amino acids (+ all AA) and in amino acid-free DMEM supplemented with all but each of the essential amino acids (EAA). (J) peIF2a and eIF2a detected by Western blot in LN229 cells cultured in the presence (+) or absence (−) of 78 µM Trp for 24 h. (K) Wars mRNA expression measured by qRT-PCR in MEFs that express wildtype Eif2a (SS) or an Eif2a version, in which serine 51 is mutated to an alanine and cannot be phosphorylated by Gcn2 (AA). MEFs were cultured for 24 h in the presence or absence of 78 µM Trp. (L) ATF4 protein detected by Western blot in LN229 cells cultured for 24 h in the presence or absence of 78 µM Trp. GAPDH served as loading control. (M) WARS mRNA expression measured by qRT-PCR in LN229 cells after knockdown of ATF4 by siRNA cultured in the absence and presence of 78 µM Trp for 24 h. (N) Correlation between ATF4 and WARS expression in human glioma (n = 50, Spearman’s rank correlation). All data are expressed as mean ± s.e.m. Statistical significance is assumed at P < 0.05 (* P < 0.05, **P < 0.01, ***P < 0.001). (O) Lolli-plot showing the absolute fold changes of all the tRNA synthetases in a microarray of U87-MG cells upon 24 h of Trp starvation.
hypothesis, that WARS upregulation enables the cells to maintain protein synthesis despite low levels of Trp.

Discussion

We show here that in addition to being induced concomitantly with IDO1 through IFNγ signaling, WARS is directly upregulated in response to Trp shortage caused by IDO1 or TDO2 activity (Figure 2 and 3). Trp shortage mediates WARS upregulation by signaling via the GCN2-peIF2a-ATF4 axis (Figure 4), as low levels of Trp result in the accumulation of uncharged tRNAs, which activate the stress kinase GCN2 (Figure 1). GCN2 then phosphorylates its substrate, eIF2α leading to reduced global protein synthesis, but increased translation of specific mRNAs such as ATF4 (Figure 1). Our results reveal that expression of GCN2 and ATF4 as well as phosphorylation of eIF2α are each required for the induction of WARS upon Trp degradation (Figure 4). ATF4 upregulation then most likely induces WARS expression via direct promoter binding.

In contrast to WARS, mitochondrial WARS2 did not correlate with IDO1 or TDO2 (Figure 1A; Figure 2B) and was regulated neither by IFNγ (Figure 1E) nor by GCN2-peIF2α-ATF4 signaling (Figure 4D and H). Both WARS and WARS2 belong to the class I aminoacyl-tRNA synthetases, which contain a characteristic Rossmann fold catalytic domain. However, WARS2 only aligns to the carboxyl-terminal part of WARS and thus the two enzymes have shared 11% sequence identity. The two TrpRS bind tRNAs with different anticodons. WARS2 binds mitochondrial tRNA<sub>Trp</sub> with the standard anticodon UCA, which codes for Trp in the mitochondria of humans, while WARS binds cytoplasmic tRNA<sub>Trp</sub>, which contains the standard anticodon CCA. Little is known about free Trp concentrations in mitochondria and it is therefore not clear how mitochondrial Trp concentrations are affected by Trp depletion. Our results reveal that Trp starvation, which most strongly induces WARS, generally appears to upregulate the expression of cytoplasmic rather than mitochondrial tRNA synthetases (Figure 4O).

In addition to its role in aminoacylation, WARS, like many other tRNA synthetases, has been implicated in cellular signaling. A truncated version of WARS is secreted in response to IFNγ and elicits angiostatic effects through inhibition of endothelial cell-cell junctions. Upon infection, monocytes secrete full-length WARS, which induces phagocytosis and chemokine production in macrophages. We therefore tested if the upregulation of WARS in response to Trp shortage also increases extracellular WARS protein levels. However, Trp starvation reduced WARS protein levels in the cell supernatants (Figure 3G), indicating that less WARS is secreted under Trp starvation conditions. Upon IFNγ stimulation, WARS has been shown to translocate into the nucleus, engendering the suppression of mTOR signaling and the induction of the expression of p53 (Figure 3F). Hence, Trp starvation appears to primarily modulate WARS levels involved in protein synthesis.

As Trp is the least abundant of the standard proteogenic amino acids, it is assumed to play a rate-limiting role during protein synthesis. Diverse mechanisms involving the suppression of mTOR signalling and the induction of autophagy have been reported to adapt cells to Trp starvation. Furthermore, activation of GCN2-peIF2α-ATF4 signaling by Trp starvation was shown to mediate the upregulation of Trp transporters, suggesting that the GCN2-peIF2α-ATF4 axis coordinates multiple adaptations to Trp starvation. Indeed, GCN2 enabled cells to slowly

Figure 5. Gcn2 protects cells against the effects of Trp shortage and enables them to optimally make use of Trp when it is replenished. (A) MEFs were cultured in the presence or absence of 78 µM Trp following a 24 h period of Trp starvation. Cell proliferation of wt and Gcn2-/- MEFs was monitored by the xCELLigence RTCA system. Displayed are the values measured every 4 h over a 3-day period. (B) Slopes of the proliferation curves depicted in (A). Data are expressed as mean ± s.e.m. Statistical significance is assumed at *P < 0.05, **P < 0.01, ***P < 0.001.)
Figure 6. Trp shortage channels Trp towards WARS and protein synthesis.  
(A) Cartoon depicting the mechanisms underlying the regulation of WARS by Trp-degrading enzymes.  
(B) WARS mRNA expression measured by qRT-PCR of LN18 glioblastoma cells treated with 0, 100 and 1000 U/ml of IFNγ in the presence and absence of 78 µM Trp.  
(C) Scheme depicting the most prominent flux changes in Trp metabolism upon Trp depletion. Fluxes were calculated by integration of microarray data from U87-MG glioblastoma cells into a computational model of Trp metabolism. Bar heights represent relative change in percentage between cells growing in normal media and cells growing without Trp. All data are expressed as mean ± s.e.m.
proliferate despite Trp depletion and to rapidly start proliferating upon Trp replenishment (Figure 5). Most likely the regulation of both Trp transporters and WARS act downstream of GCN2 to adapt the cells to low Trp conditions and to enable them to optimally make use of Trp once it is available again.

Interestingly, also IFNγ has been reported to induce a Trp-selective transporter 47 and IFNγ-induced WARS was recently shown to augment intracellular Trp levels 48. The redundancy of IFNγ (which leads to Trp degradation via IDO1 induction), and GCN2-peIF2α-ATF4 signaling (which is activated upon low Trp levels), in inducing WARS and Trp transporters may hint to the importance of securing sufficient intracellular Trp levels. Most likely, IFNγ will already induce WARS and Trp transporters before Trp levels low enough to activate GCN2 are reached. Of note, IFNγ-induced WARS mRNA was further increased in response to Trp starvation (Figure 6B), suggesting that a more pronounced upregulation of WARS is possible if Trp levels continue to decline.

Although several studies have shown that amino acid transporters are upregulated in response to Trp deprivation to increase Trp import, 34,35,47,49, it is unclear whether this intracellular increase in Trp leads to further degradation by Trp catabolizing enzymes or can be used for protein synthesis. By applying computational modelling of Trp usage in different pathways, we confirmed the upregulation of Trp transporters 35, which resulted in enhanced influx of Trp into the cells but also increased efflux of Kyn out of the cells (Figure 6C). However, most strikingly, Trp shortage channeled Trp towards WARS (Figure 6C).

In conclusion, we show here that in tumor cells, Trp depletion mediated by the expression of IDO1 and/or TDO2 upregulates WARS via GCN2-peIF2α-ATF4 signaling, which shifts Trp usage towards protein synthesis. The GCN2-dependent upregulation of WARS and Trp transporters enables cells to adapt to Trp shortage and to make optimal use of Trp once it is replenished. Hence, this study sheds light on an important compensatory mechanism allowing tumor cells to grow despite degrading an essential amino acid.

**Methods**

**Analysis of expression data**

For correlation analyses, data was downloaded from the R2: Genomic Analysis and Visualization Platform (http://hgserver1.amc.nl) and Gene Expression Omnibus (GEO). The following datasets were used: “Tumor Glioma Kawaguchi” (GSE43378), “Tumor Breast Chin” (GSE69031), “Tumor Colon Sieber-Smith” (GSE14333 + GSE17538 minus identical samples), “Tumor Lymphoma Hummel” 50, “Tumor Ovarian Anglesio” 52. Probes considered for analyses were: ATF4: 200779_at, CD2: 205831_at, CD3D: 213539_at, IDO1: 210029_at, IFNG: 210354_at, IRF1: 202531_at, TDO2: 205943_at, WARS: 200629_at. As for WARS2 the same probes were not available for all datasets, 222734_at was employed for “Tumor Ovarian Anglesio”, “Tumor Glioma Kawaguchi” and “Tumor Colon Sieber-Smith”, while 218766_s_at was used for “Tumor Breast Chin” and “Tumor Lymphoma Hummel”.

**Cell culture**

Human cancer cell lines were obtained from ATCC. MEFs eIF2α51A/SS1A (AA-MEFs) and the corresponding controls, MEFs eIF2α51A/SS1S (SS-MEFs) 53 were obtained from the R. Kaufman laboratory. Cells were cultivated in DMEM (Gibco) supplemented with 10% FCS (Gibco), 100 U/ml penicillin and 100 µg/ml streptomycin (Gibco).

For essential amino acid depletion, cells were cultured for 24 h in DMEM without amino acids (Thermo Fisher Scientific) supplemented with all amino acids at the concentrations of regular DMEM but lacking each essential amino acid. Regular DMEM (Gibco) and DMEM without amino acids (Thermo Fisher Scientific) supplemented with all amino acids at the concentrations of regular DMEM were used as controls. L-Arginine, L-Glutamine, L-Histidine, L-Serine, L-Threonine, L-Valine and L-Isoleucine were all from Genaxxon, L-Tryptophan, L-Cysteine, L-Leucine and L-Lysine were all from Sigma-Aldrich, L-Glycine, L-Phenylalanine and L-Tyrosine were from Carl Roth, and L-Methionine was from Us Biologicals. All media were supplemented with 10% dialyzed FCS (Gibco).

**Drug and cytokine treatment**

Cells were treated with recombinant human IFNγ (#14–8319-80, eBiosciences) at concentrations of 100 and 1000 U/ml for 8 and 24 h. For inhibition of IFNγ signaling an anti IFNγ antibody (#554,698, BD Bioscience) was applied at 5μg/ml.

**Preparation of T cell supernatants**

Peripheral blood mononuclear cells were prepared from heparinized venous blood of healthy donors by density-gradient centrifugation. T helper (Th) cells were separated using a CD4+ T cell isolation kit II (Miltenyi Biotec GmbH) according to the manufacturer’s instructions (purity ≥97% CD4+ cells). Th cells were cultured in RPMI 1640 medium (Thermo Fisher Scientific) containing 10% FCS in the presence of 5 μg/ml phytohemagglutinin (Sigma-Aldrich) and 20 ng/ml rhIL-2 (Novartis) for 4 days. Activated T cell supernatants were harvested, centrifuged and stored at −80°C.

**RNA isolation and quantitative (q)RT-PCR**

Total RNA was isolated using the Qiagen RNAeasy Mini Kit (Qiagen) following the manufacturer’s instructions. One microgram RNA was reversed transcribed to cDNA using the High Capacity cDNA reverse transcriptase kit (Applied Biosystems). (q)RT-PCR was carried out in quadruplicates with the SYBR Select Master Mix (Thermo Fisher Scientific) with a StepOnePlus real-time PCR system (Applied Biosystems).
**Protein isolation and western blotting**

Cells were lysed in ice-cold RIPA lysis buffer (1% IGEPA/ NP40, 12 mM sodium deoxycholate, 3.5 mM SDS) supplemented with a protease and phosphatase inhibitor (Roche Sigma-Aldrich) to extract total protein. Nuclear and cytoplasmic fractions were prepared using the NE-PER Nuclear Cytoplasmic Extraction Reagent kit (Pierce) according to the manufacturer’s instruction. Protein concentrations were determined by Bradford Protein Assay (BioRad) according to the manufacturer’s recommendations. 10 to 20 µg of protein were separated by 10–12% SDS-PAGE. Proteins were transferred onto 0.2 µm nitrocellulose membranes, blocked with 5% BSA for 1 h, and stained with the corresponding primary antibodies overnight. Primary antibodies: rabbit anti-human IDO1 (#AG-25A-0029-C100, Adipogene AG), mouse anti-human GAPDH (#39–8600, Thermo Fisher Scientific), mouse anti-human β-Actin (#MA5-15,739, Thermo Fisher Scientific), mouse anti-Lamin A/C (#MA3-1000, Thermo Fisher Scientific), rabbit anti-human WARS (#GTX62563, Gene Tex, Inc.), rabbit anti-human IDO1 (Abcam plc.), goat anti-human ATF4 (#sc7583, Santa Cruz Biotechnology, Inc.), rabbit anti-human GCN2 (#PA5-17523# Pierce Protein Biology), were diluted 1:1000 in blocking solution.

For detection, membranes were stained with HRP-conjugated secondary antibodies (α-rabbit: #GENA9340-1M, GE Healthcare Europe GmbH; α-mouse: #SC-2020, Santa Cruz Biotechnology; α-goat: #GENXA931, GE Healthcare) diluted 1:5000 for 1 h at room temperature (RT). Signals were detected using either Pierce® ECL Western Blotting Substrate or SuperSignal® West Femto Maximum Sensitivity Substrate (both Thermo Scientific). Images were captured on the BioRad ChemiDoc MP system with Image Lab 5.1 software.

**ELISA of cell supernatants**

WARS protein levels were measured in FCS-free cell supernatants of A172 and LN229 glioblastoma cells cultured in the presence or absence of Trp for 48 h using a commercially available ELISA kit (Elabscience) according to the manufacturer’s protocol.

**Generation of TDO2 overexpression cell lines**

A TDO2 cDNA clone flanked by Gateway compatible recombination sites was obtained from MyBiosource. The cDNA clone was recombined into the pLX301 vector (Addgene plasmid #25895), using the Gateway® LR Clonase Enzyme mix (Thermo Fisher Scientific) according to the manufacturer’s protocol. The pLX301-TDO2 expression vector or the empty control pLX301 vector was co-transfected into HEK293T cells using lentiviral packaging plasmids. The resulting lentiviral supernatants were used to infect LN229 cells. Cells with stable integration of the expression vectors were selected and maintained in complete DMEM containing 1µg/ml puromycin. The stable overexpression of TDO2 was confirmed by qRT-PCR, while the functional activity of the overexpressed protein was verified by enhanced Kyn and reduced Trp levels in the supernatants of the TDO2 overexpressing cells, as measured by HPLC.

**Overexpression of IDO1 in HEK 293 cells**

Starting from the pDEST26 vector (Invitrogen, Thermo Fisher Scientific), the 6xHis-tag was removed by site-directed mutagenesis PCR to derive pDEST. Subsequently, a single C-terminal Flag-tag (Flag-C) was introduced into pDEST. The full-length cDNA sequence of IDO1 was cloned into pDEST-Flag-C via Gateway® cloning resulting in pDEST-IDO1-FLAG-C. HEK293 cells were seeded into 6 well plates, cultured for 24 h and transfected with 2 µg of pDEST-IDO1-FLAG-C or empty control vector using FUGENE HD reagent (Roche).

**Trp and kyn measurement by high performance liquid chromatography (HPLC)**

Trichloroacetic acid was added to cell culture supernatants (162.8 µl, 72% to 1 ml of supernatant) for protein precipitation. Trp and Kyn concentrations were measured on a Dionex Ultimate® 3000 uHPLC (Thermo Fisher Scientific). Chromatographic separation was achieved on a reversed phase Accucore® aQ column (2.6 µm, Thermo Scientific) with a gradient mobile phase (see Table S1) consisting of 0.1% trifluoroacetic acid (TFA) in water (A) and 0.1% TFA in water (B).
in acetonitrile (B). Trp and Kyn peaks were identified based on comparison to standards, their retention time and UV emission spectra at 280 nm (Trp) and 365 nm (Kyn). Results were analyzed using the Chromatography Data System (Thermo Scientific).

**Modulation of Trp levels**

An overview of the modulation of Trp levels is provided in Fig. S3. For Trp starvation experiments, cells were cultured in custom-made medium without Trp (Thermo Fisher Scientific) supplemented with dialyzed FCS (Thermo Fisher Scientific). For the control medium, 78 µM Trp, which represents the Trp concentration present in regular DMEM, was added to the Trp-free medium. For Trp supplementation experiments, additional 78 µM of Trp were added to the control medium on day 3 of cultivation.

**Generation of wt and Gcn2 -/- mefs**

C57BL/6j wt mice were purchased from Charles River (Wilmington, MA, USA). Gcn2-/- (B6.129S6-Eif2ak4tm1.2Dron/J) mice were obtained from the Jackson Laboratory (Bar Harbor, ME, USA). Following uterus dissection, 14.5 days old embryos were isolated and washed in PBS. The embryos were mechanically minced, and subsequently digested enzymatically using 0.25% Trypsin/EDTA for 5 minutes at 37°C. Tissue suspensions were homogenized by serially passing them through 18G, 23G and 25G needles. Single cells were cultured in complete DMEM until harvest.

**Real-time analysis of cell proliferation**

Cell proliferation was monitored in real-time using the xCelligence RTCA system (Acea Bioscience, Inc.). Wt and Gcn2 -/- MEFs were seeded in duplicates at a total of 3,000 cells per chamber. Proliferation was measured at 30 minutes intervals for 4 days as a relative change in electrical impedance between the cell free medium containing well and the impedance measured at each monitoring time point thereafter. Growth curves are depicted in the RTCA software as changes in the cell index over time. Proliferation rates for each of the treatments were determined by comparison of the slopes of these growth curves using the RTCA software 1.2.

**Modeling of Trp metabolism**

To calculate flux changes between U87-MG cells under Trp sufficiency or deprivation, we extended the previously published mathematical model of Trp metabolism to include the amino acid transporter SLC1A5. As kinetic constants for this transporter are not available, we used the constants previously integrated for SLC7A5. Microarray data of U87-MG cultured in Trp-free or Trp-containing medium for 24 h were integrated into the model using SBMLmod as described previously. For the microarray U87-MG cells were cultivated in Trp-free or Trp-containing medium for 24 h, harvested and RNA was isolated using the RNeasy Mint Kit (Qiagen). The RNA was biotin-labeled and hybridized to an Illumina human whole genome Sentrix HumanRef-8 Expression BeadChip (Illumina) following the manufacturer’s protocol. Microarrays were scanned on a beadstation array scanner and the raw data extracted using the beadarray R package from bioconductor.org. Bead outliers were removed if their expression value dropped below a threshold defined by the imaging system background, non-specific binding and cross hybridization signal. Individual bead types were flagged based on bead replicate count. Data were globally normalized using the Bioconductor lumi package.

A concentration of 5 µM free Trp corresponding to the medium blood concentration of free Trp was assumed for the calculation of steady state fluxes to resemble physiological conditions.

**Statistical analyses**

Statistical analyses were performed using GraphPad Prism version 5.00 (GraphPad Software Inc.) or SigmaPlot 13 (Systat Software GmbH). Correlation analyses were based on Spearman’s rank analysis. Two-tailed Student’s t-tests were used for single comparisons. Where applicable, rank sum analysis by Mann-Whitney U and one-way ANOVA were conducted. All data are expressed as mean ± s.e.m. Statistical significance is assumed at $P < 0.05$, **$P < 0.01$, ***$P < 0.001$.

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**Disclosure statement**

No potential conflict of interest was reported by the authors.

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