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# Clinical and Translational Article Patient-derived head and neck cancer organoids allow treatment stratification and serve as a tool for biomarker validation and identification 



Today, head and neck cancer treatment options are limited, and relapse rates are high. Millen et al. show that head and neck cancer organoids can predict patient response, capture the genetic heterogeneity of the patient population, and be applied to screen novel therapies for efficacy and biomarker association.

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## Highlights

Patient-derived organoid response to radiotherapy correlates with patient response

Cetuximab, combined with radiotherapy in clinic, is a radioprotector in organoids

Gene editing can be used to validate biomarkers in head and neck cancer organoids

Drug screening of the patientderived organoid biobank can explore novel therapies

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# Clinical and Translational Article 

# Patient-derived head and neck cancer organoids allow treatment stratification and serve as a tool for biomarker validation and identification 

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#### Abstract

SUMMARY Background: Organoids are in vitro three-dimensional structures that can be grown from patient tissue. Head and neck cancer (HNC) is a collective term used for multiple tumor types including squamous cell carcinomas and salivary gland adenocarcinomas. Methods: Organoids were established from HNC patient tumor tissue and characterized using immunohistochemistry and DNA sequencing. Organoids were exposed to chemo- and radiotherapy and a panel of targeted agents. Organoid response was correlated with patient clinical response. CRISPR-Cas9-based gene editing of organoids was applied for biomarker validation. Findings: A HNC biobank consisting of 110 models, including 65 tumor models, was generated. Organoids retained DNA alterations found in HNC. Comparison of organoid and patient response to radiotherapy (primary $[\mathrm{n}=6]$ and adjuvant $[\mathrm{n}=15]$ ) indicated potential for guiding treatment options in the adjuvant setting. In organoids, the radio-sensitizing potential of cisplatin and carboplatin could be validated. However, cetuximab conveyed radioprotection in most models. HNC-targeted treatments were tested on 31 models, indicating possible novel treatment options with the potential for treatment stratification in the future. Activating PIK3CA mutations did not predict alpelisib response in organoids. Protein arginine methyltransferase 5 (PRMT5) inhibitors were identified as a potential treatment option for cyclindependent kinase inhibitor 2A (CDKN2A) null HNC. Conclusions: Organoids hold potential as a diagnostic tool in personalized medicine for HNC. In vitro organoid response to radiotherapy (RT) showed a trend that mimics clinical response, indicating the predictive potential of patient-derived organoids. Moreover, organoids could be used for biomarker discovery and validation.


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## INTRODUCTION

Organoids are three-dimensional structures that can be grown from patient-derived stem cells and have been shown to recapitulate in vivo pathology and physiology. Organoids can be maintained in vitro to serve as miniature disease models. Collections of tumor organoids (so-called "living biobanks") derived from a range of tumor types have been shown to recapitulate the tumors from which they were derived,

## CONTEXT AND SIGNIFICANCE

Organoids are structures grown from patient tissues. Researchers from the Hubrecht Institute have generated a collection of these patient samples from head and neck cancers. By exposing these structures to radiotherapy, the authors showed that organoids could have predicted how the patients responded to therapy, suggesting that organoids might help to choose the best treatment for each patient. This approach can also help to identify or validate new treatment options by treating a panel of organoids with multiple new drugs and studying their effect. These study results are important for patients with head and neck cancer, as-today-their treatment options are limited, and there is no way to predict if they will actually benefit from their harsh treatments.
both genetically and phenotypically. ${ }^{1-9}$ Patient-derived organoids hold promise for personalized medicine, as multiple studies have shown correlation between organoid drug response and corresponding patient response., ${ }^{8,10-13}$

To address whether organoids hold potential to stratify treatment for patients with head and neck cancer (HNC), we measured the response of organoids to either radiotherapy (RT) or chemoradiotherapy (CRT) and compared this with the response of patients diagnosed with primary HNC. HNC is a collective term for tumors arising in the upper aerodigestive tract, including the oral cavity, larynx, and pharynx, and salivary glands. The most common HNC is head and neck squamous cell carcinoma (HNSCC). HNSCC is commonly associated with heavy smoking and drinking. ${ }^{14,15}$ An increasing subset of HNSCC is associated with human papillomavirus (HPV) infection. ${ }^{14,15}$ Treatment of HNSCC consists of surgery, RT, and/or CRT, where the chemotherapy is given as a radiosensitzer. ${ }^{16}$ In 2018, RT combined with the antiEGFR antibody cetuximab was introduced as an alternative treatment for patients unsuitable for classic, platinum-based chemotherapy based on platinum compounds. Yet, cetuximab has conversely been shown to act as a radioprotector in HNC in vitro, both in cell lines as well as in organoid models, ${ }^{17,18}$ and thus its usage as a chemosensitizing agent could be questioned. Indeed, more recent clinical studies failed to reproduce the added value of cetuximab and have even found inferior effects of cetuximab treatment in the majority of patients. ${ }^{19-21}$

Adequate biomarkers to determine which patients would benefit from a treatment are lacking in HNC even though different therapies are available and more targeted agents are being evaluated in clinical trials. ${ }^{22}$ Pre-clinically identified biomarkers often fail once tested in patients. This likely relates to the fact that the pre-clinical in vitro models used for testing do not recapitulate the effect of the biomarker within the genetic context of a real-world patient population. Therefore, validation of potential biomarkers in more accurate models that better reflect patient heterogeneity are urgently needed. This is exemplified by the above-mentioned studies on cetuximab. ${ }^{19-21}$ Human cancer-derived organoids may fill this void, potentially combined with efficient gene-editing tools such as CRISPR-Cas9 to validate a genetic biomarker effect on drug response. Gene editing using CRISPR-Cas9 technology has previously been successfully applied in organoid models. ${ }^{23-27}$ Recently, nextgeneration Cas9 proteins have been developed by disabling the nuclease activity of Cas9 and fusing enzymes to Cas9 that modify individual bases in the DNA helix. These fusion proteins are termed base editors and induce single base changes, allowing for highly precise and efficient gene editing with very low off-target rates. ${ }^{27-30}$ To our knowledge, gene editing in HNC organoids has not been reported until now. ${ }^{28-31}$

In 2019, we published a biobank containing 31 HNSCC-derived organoids, as well as the protocol to generate these organoid lines directly from patients' tumor tissues. ${ }^{17}$ In this study, we expand this biobank with additional organoid models including those derived from rarer forms of HNC. We furthermore explore the potential of organoids for biomarker validation and personalized medicine.

## RESULTS

## Organoid biobank composition

From 2019 to 2022, 354 tissue samples were collected from 228 patients during routine surgical resection or biopsy procedures. Tissues were subsequently processed for organoid generation. This consisted of 194 tumor samples, 138 normal
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Figure 1. Generation and characterization of a large and diverse organoid biobank derived from patient head and neck tumors and tumor-adjacent non-malignant epithelium
(A) Composition of the generated HNC organoid biobank. Left pie chart depicts the anatomical location of primary tissue from which tumor organoids were established. Second pie chart indicates the histological type of the tumor organoids established ( $n=65$ ) including squamous cell carcinoma (SCC) ( $n=60$ ), adenocarcinoma (AC) $(n=1)$, and other types. Right pie chart displays other histological types: large cell carcinoma (LCC), mucoepidermoid (MucoEC), adenoid cystic carcinoma (AdCC), and myoepithelial carcinoma (MyoEC), $n=1$ for each. See also Table 1 and Figure S1A.
(B) Bar graph displays percentage of organoid models established on both media tested ( $n=43$ ), which grow superior growth in either M7 medium (purple, M7 > HN) or HN medium (blue, HN > M7) or show comparable growth in both media (black, HN = M7). See also Figures S1B-S1D.
(C) Histological and immunohistochemical evaluation of hematoxylin and eosin (H\&E), carcinoma cell marker AE1AE3, SCC marker cytokeratin 13
(CK13), basal cell marker tumor protein 63 (p63), and HPV detection protein 16 (p16) in tumor tissue and matching tumor organoid T41. Scale bars: $50 \mu \mathrm{~m}$ (top) and $200 \mu \mathrm{~m}$ (bottom).
(D) Total HPV type 16 (HPV16; purple) and human ESR1 (hESR1; dark blue) DNA molecules detected in the tissue (solid bars) and organoid (striped bars) by digital droplet PCR (ddPCR) in tumor organoid T41. Error bars indicate standard deviations.
(E) Immunohistochemical evaluation of periodic-acid Schiff with dispase (PAS-D; magenta), $\alpha$-amylase (dark brown), and aquaporin-5 (AQP5; dark
brown) in organoids established from 2 patients with salivary-gland cancer (N19 and T73) and squamous cell-derived tumor organoid (T1) as negative control. Scale bar: $200 \mu \mathrm{~m}$.
(F) Immunohistochemical evaluation of CDX2 in T36, established from a patient with a rare intestinal-type AC (ITAC) derived from the nasal cavity. Scale bar: $200 \mu \mathrm{~m}$. See also Figure S1E.
(G) Fraction of $\gamma$-H2AX-positive nuclei per organoid in untreated (solid bars) vs. mitomycin C-treated (striped bars) in T13 and T46 organoids. Error bars indicate standard deviations.
(H) Immunofluorescent staining of anti $\gamma$-H2AX-positive nuclei (green) counterstained with DAPI (blue) in FA-derived T46 and non-FA T13. Scale bar: $100 \mu \mathrm{~m}$.
(tumor-adjacent) samples, and 22 metastatic tumor samples. Organoid establishment rates for these different tissue samples were $28.4 \%, 32.6 \%$, and $4.5 \%$, respectively (Figure S1A). A subset of tumor tissue samples received in the lab were evaluated by a pathologist using hematoxylin and eosin (H\&E) staining to determine if epithelial (tumor) cells were present in the tissue used to generate organoids. If epithelial cells were present, the success rate of organoid establishment increased from $33.3 \%$ to $85.5 \%$ ( $n=77$, Fisher's exact test, proportion 0.522, $p<0.001$ ).

The resulting biobank consisted of 100 newly generated organoids, including 10 tumor organoids that were previously established ( $n=110$ ). ${ }^{17}$ These models were derived from 97 patients with HNC of various anatomical locations and histological cancer subtypes (Figure 1A; Tables 1 and S1).

## Organoid establishment and cryopreservation

After sufficient expansion, organoid models were cryopreserved 2-3 days after passaging. $70.9 \%$ of cryopreserved models could be successfully recovered and expanded from cryopreservation (Table S1). Single-nucleotide polymorphism sequencing was used to exclude sample swaps where reference material was available (Table S1). Primary cultures were expanded on both previously published Head and Neck (HN) medium ${ }^{17}$ and on more recently published cervical SCC organoid medium (M7). ${ }^{32}$ Of the cultures started on both medium types $(n=43), 60.5 \%$ and $11.6 \%$ showed better growth on M7 or HN medium, respectively (Figure 1B). For 27.9\%, the medium choice showed no difference. Cultures established on M7 medium typically had an increase in organoid number and size and resulted in faster biobanking (Figure S1B) but did not show an apparent different morphology (Figure S1C).

## Established organoid models retain histopathological and molecular features of primary HNC

To assess if histopathological features of HNC were retained in the established organoid models, immunohistochemical staining for HNC markers was performed. Organoid T41, derived from HPV+ tumor tissue, recapitulated the original tissue's expression of pan-cytokeratin AE1AE3 (epithelial cell marker), cytokeratin 13 (CK13; differentiated squamous cell marker), p63 (basal cell marker), and p16

| Characteristic (no. patients) | Whole biobank ( $\mathrm{n}=97$ ) | Tumor organoids ( $\mathrm{n}=66$ ) | Cohort, primary RT ( $\mathrm{n}=6$ ) | Cohort, adjuvant RT ( $\mathrm{n}=15$ ) |
| :---: | :---: | :---: | :---: | :---: |
| Age, years |  |  |  |  |
| Median (range) | 66 (22-90) | 66 (22-90) | 72 (59-90) | 61 (29-76) |
| Sex, no. (\%) |  |  |  |  |
| Male | 62 (64) | 45 (68) | 3 (50) | 11 (73) |
| Female | 35 (36) | 21 (32) | 3 (50) | 4 (27) |
| Organoids, no. (\%) |  |  |  |  |
| Tumor | 66 (60) | 66 (100) | 6 (100) | 15 (100) |
| Normal | 44 (40) | - | - | - |
| Tumor organoids origin, no. (\%) |  |  |  |  |
| Biopsy | 27 (25) | 21 (32) | 6 (100) | - |
| Resection specimen | 83 (75) | 45 (68) | - | 15 (100) |
| Location tumor organoids, no. (\%) |  |  |  |  |
| Oral cavity | - | 32 (48.5) | - | 11 (73) |
| Oropharynx | - | 7 (10.6) | 1 (17) | - |
| Hypopharynx | - | 3 (4.5) | - | 2 (13) |
| Larynx | - | 15 (22.7) | 5 (83) | 1 (7) |
| Nasal cavity | - | 4 (6.1) | - | 1 (7) |
| Salivary glands | - | 4 (6.1) | - | - |
| Unknown primary | - | 1 (1.5) | - | - |
| Type tumor organoids, no. (\%) |  |  |  |  |
| Squamous cell carcinoma | - | 61 (92.4) | 6 (100) | 15 (100) |
| Adenocarcinoma | - | 1 (1.5) | - | - |
| Muco epidermoid carcinoma | - | 1 (1.5) | - | - |
| Adenoid cystic carcinoma | - | 1 (1.5) | - | - |
| Myoepithelial carcinoma | - | 1 (1.5) | - | - |
| Large cell carcinoma | - | 1 (1.5) | - | - |
| HPV status |  |  |  |  |
| Positive (type 16) | - | 4 (6.1) | - | - |
| Positive (type 33) | - | 1 (1.5) | - | - |
| Negative | - | 4 (6.1) | 1 (17) | 2 (13) |
| ND | - | 57 (86.4) | 5 (83) | 13 (87) |
| T stage, no. (\%) |  |  |  |  |
| T0 | - | 1 (1.5) | - | - |
| T1 | - | 7 (10.6) | - | 2 (13.3) |
| T2 | - | 26 (39.4) | 3 (50) | 2 (13.3) |
| T3 | - | 14 (21.2) | 3 (50) | 3 (20) |
| T4/T4a/T4b | - | 18 (27.3) | - | 8 (53.3) |
| N stage, no. (\%) |  |  |  |  |
| NO | - | 37 (56.1) | 6 (100) | 3 (20) |
| N+ | - | 29 (43.9) | - | 12 (80) |
| M stage, no. (\%) |  |  |  |  |
| MO | - | 65 (98.5) | 6 (100) | - |
| MX | - | 1 (1.5) | - | - |
| Adjuvant treatment |  |  |  |  |
| Cisplatin | - | - | - | 4 (27) |
| Relapse, no. (\%) |  |  |  |  |
| Local | - | - | 3 (50) | 1 (7) |
| Regional | - | - | 1 (17) | 8 (53) |
| Distant | - | - | 1 (17) | 4 (27) |
| No relapse | - | - | 3 (50) | 6 (40) |

(surrogate marker for HPV infection) (Figure 1C). Molecular HPV testing using HPVspecific digital droplet PCR confirmed HPV positivity of the organoid models (Figure 1D). In total, 8/9 (88.9\%) organoid models established from HPV+ tissue could be biobanked.

As HNC is characterized by a high frequency of TP53 mutations, ${ }^{33}$ TP53 status of organoids was assessed by in vitro treatment with Nutlin-3a. Nutlin-3a is a MDM2 antagonist that ceases growth of TP53 wild-type cells but leaves TP53 mutant cells unaffected. ${ }^{34} 63 \%$ of tested organoid cultures were insensitive to $10 \mu \mathrm{M}$ Nutlin-3a (Figure S1D), a percentage in line with reported TP53 mutation frequencies in HNC. ${ }^{33}$

## Organoid models of rare HNCs

In addition to organoids derived from HNSCC, organoid models were successfully established from less common HNCs. These included salivary gland tumors, intesti-nal-type adenocarcinoma (ITAC), and Fanconi anemia-induced HNSCC, described in more detail below.

Four salivary gland tumor organoid models (derived from mucoepidermoid carcinoma, large cell carcinoma, adenoid cystic carcinoma, and myoepithelial carcinoma, respectively) and five non-cancer salivary gland models (from tumor-adjacent normal gland tissue) were established and biobanked (Table S1). Immunohistochemical staining for salivary gland markers on N19 and T73 confirms that salivary glandderived organoids retain salivary gland tissue characteristics including production of mucin (PAS-D) and $\alpha$-amylase (a key component of saliva) and expression of aquaporin-5 (AQP5), which are not present in the HNSCC-derived organoid model T1 (Figure 1E).

Organoid T36 was established from a sinonasal ITAC, a tumor that histologically resembles intestinal adenocarcinoma. ${ }^{35} \mathrm{~T} 36$ showed a mixed phenotype with cystic structures similar to intestinal organoids and dense structures resembling squamous epithelium-derived organoids (Figure S1E). Cystic structures express intestinal epithelial marker CDX2 whereas the dense organoids do not (Figure 1F). Therefore, we conclude that culture T36 is a mixture of both ITAC cells and nasal cavity squamous epithelium.

Lastly, organoid T46 was derived from an HNC of a patient with Fanconi anemia. ${ }^{36}$ Fanconi anemia is caused by genetic defects resulting in Fanconi anemia pathway inactivation, a pathway important for the repair of DNA double-stranded breaks. ${ }^{36}$ When organoids were exposed to mitomycin-C (MMC), a compound that induces double-stranded DNA breaks, indeed, T46 showed increased sensitivity to MMC compared with non-Fanconi anemia organoid T13 (Figures 1G and 1H).

Taken together, organoids can successfully be derived from a range of HNC tumor types. Resulting organoid models retain key characteristics of these distinct tumor types.

## Genetic landscape of HNC organoids

Organoids were subjected to DNA sequencing to confirm that generated organoids were derived from tumor cells and not from tumor-adjacent non-cancerous epithelium, which is a previously described concern when establishing organoids. ${ }^{37,38}$ Thir-ty-five organoid cultures were sequenced using either targeted next-generation sequencing (NGS; $n=5$ ) or whole-exome sequencing (WES, $n=30$ ). Only organoids carrying mutations in known tumor suppressors or oncogenes (see Figure 2A; 27 of 35 sequenced models) were considered tumor organoids and were taken along in downstream genetic and drug-screening analyses.

Detected DNA alterations included a high frequency of mutations in known cancerassociated genes TP53, NOTCH1, PIK3CA, FAT1, and APOB (Figure 2A). These


C


E

## chromosome



Figure 2. Patient-derived HNC organoids recapitulate genetic alterations found in HNC
(A) Oncoplot of mutations detected by DNA sequencing of organoid models. Left: alterations detected in 30 organoid cultures that underwent wholeexome sequencing (WES). Right: alterations detected in 5 organoid cultures that were sequenced using a targeted hotspot DNA sequencing panel (B) High-level copy-number variations (CNVs) detected in HNC organoids (top) compared with CNVs described in reference HNC datasets generated by sequencing primary patient tumors. ${ }^{26,27}$ Red indicates a chromosomal amplification and blue a chromosomal deletion
(C) Gene-level CNVs detected in HNC organoids. Gene copy number is indicated by color where red and purple indicate gene gain and blue indicates gene loss.
(D) Circosplot describing SNVs detected in peripheral blood mononuclear cell (PBMC; germline, light blue, inner track), primary tumor tissue (red, middle track), and organoid culture (dark blue, outer track) of T 12 . See Figure S 2 for cirosplots for all sequenced samples.
(E) CNV scatterplot of alterations detected in germline (light blue), primary tumor tissue (red), and organoid culture (dark blue). Each dot represents a genomic region of 5 MB . Copy number is indicated on the y axis. Autosomal and sex chromosomes are ordered from left to right.
mutations are indeed described in HNC. ${ }^{33}$ Detected copy-number variations (CNVs) were comparable to those described by independent studies of primary HNSCC samples. ${ }^{39,40} \mathrm{CNV}$ profiles of the organoids are characterized by loss of chromosomes $3 p, 8 p$, and $17 q$ and a gain of chromosomes $3 q, 8 q$, and 20 (Figure 2B). Gains of oncogenes including PIK3CA, FGF3, and FGF4 and loss of tumor suppressor cy-clin-dependent kinase inhibitor 2A (CDKN2A) in the HNC organoid biobank were detected (Figure 2C). ${ }^{39,40}$ Single-nucleotide variants (SNVs) and CNVs present in pa-tient-derived organoids were comparable to those observed in the tumor tissue from which they were derived (Figures 2D and 2E; Data S1). An enrichment of CNVs in organoids could be observed when compared with tissue DNA (Figure 2E); this is expected as cancer organoids consist entirely of tumor cells, whereas the primary tissue still contains tumor microenvironment cells including stromal and immune cells. Taken together, the genetic landscape of the HNC tumor organoids reflects DNA alterations observed in the tissue from which they are derived and corresponds to alterations described in HNC tumor databases.

## Correlation between HNSCC organoid treatment and clinical response

To evaluate organoid sensitivity to RT, organoids were exposed to increasing doses of radiation ( 1 to 10 Gy ) (Figure 3A). For all organoid screens, organoid viability was assessed using the CellTiter-Glo 3D assay. Differences in RT sensitivities were observed between models derived from different patients (Figure 3B, showing eight representative models). In total, 41 tumor organoids were successfully thawed, expanded, and screened in biological duplicate for RT sensitivity (Figures S2A and S2B). Correlation was observed between area under the curve (AUC) values obtained from biological duplicates ( $r^{2}=0.61$; Figure S2C).

Of the 41 screened organoids models, 21 were derived from patients who received primary ( $n=6$ ) or postoperative RT ( $n=15$ ). For these models, in vitro organoid response was subsequently correlated with clinical patient response.

## Correlation of organoid and patient response in patients treated with adjuvant RT

Organoid models derived from patients receiving adjuvant RT were divided into sensitive and resistant based on the median values of "viability at 2 Gy " and "GR50" in the 15 screened organoids. Organoids $\leq 84.2 \%$ viable at 2 Gy were marked sensitive, and organoids that were $>84.2 \%$ viable at 2 Gy were marked resistant. For GR50-based classification, the median of 9.1 was applied as a cutoff (Figure 3C). Classification was also performed using AUC and IC50 as parameters of response (Figure S2D) as others have previously used these metrics. Patients corresponding to sensitive organoids showed longer relapse-free survival (Figure 3D). These results indicated a correlation between in vitro organoid and patient clinical response, which is statistically significant when categorized with GR50 ( $p=0.01$ log rank test; Table 2) but not for viability at $2 \mathrm{~Gy}(\mathrm{p}=0.08$, log rank test; Table 2).

A


B


C



D


Figure 3. Radio- and chemoradiotherapy drug screening of patient-derived organoid models compared with clinical response
(A) Bright-field images of HNC organoids exposed to increasing radiation dosage ( $0,1,2,4,6,8$, and 10 Gy). Scale bar: $100 \mu \mathrm{~m}$.
(B) Organoid viability in percentage, relative to untreated controls, of eight 8 HNC organoid cultures exposed to increasing dosages of irradiation. Light blue to navy colors depict sensitive cultures, and yellow to red colors depict more resistant cultures. Error bars indicate standard error of the mean (SEM) of 6 technical replicates per biological replicate. Each curve depicts the average of two biological replicates. See also Figures S3A-S3C.

Figure 3. Continued
(C) Left: scatter dot plot of organoid viability at 2 Gy. Purple squares indicate models classified as resistant (above median), and blue circles indicate models classified as sensitive (below median). Response is evaluated by organoid viability percentage at RT dose of 2 Gy ( $\mathrm{n}=15$ ). Each point represents the mean of 2 biological replicate experiments. Median is indicated by solid red line. Right: Kaplan-Meier plot with probability of relapse (in months) of patients treated with adjuvant RT stratified by organoid response. See also Figures S3D and S3E.
(D) Left: scatter dot plot of organoid GR50. Purple squares indicate models classified as resistant (above median), and blue circles indicate models classified as sensitive (below median). Response evaluated by GR50 ( $n=8$ ). Each point represents the mean of 2 biological replicate experiments. Median is indicated by solid red line. Right: Kaplan-Meier plot with probability of relapse (in months) of patients treated with adjuvant RT stratified by organoid response. See also Figures S3D and S3E.

Cox regression indicated that patients whose organoids were resistant based on GR50 score had a hazard ratio of 1.24 ( $p=0.05$; Table 2), indicating increased risk of relapse. Patients with a nodal status N0/N1 relapsed later compared with patients with nodal status N2/N3 (Figure S2E). Patients with a pathology-confirmed radical resection relapsed later compared with patients with an irradical resection (Figure S2F).

## Correlation of organoid and patient response in patients treated with primary RT

For the six organoid models derived from patients receiving primary RT, the same analysis was performed as described above. Here, median viability was $79.5 \%$ at 2 Gy. No significant differences in patient clinical response were observed between sensitive and resistant organoids (Figure S2G), although sample size is small. Patients who got RT on the neck relapsed later compared with patients without neck RT (Figure S2H).

## Combination therapy vs. monotherapy in vitro show differential responses

Five organoid models were generated from patients receiving CRT. One patient received RT + cetuximab, and 4 patients received RT + cisplatin. Organoids were treated with RT alone, chemotherapy alone, or CRT (Figures S3A-S3C). ${ }^{36}$ Of the tested models, T12 was the most sensitive to CRT (Figure S3B). T12 therapy response was compared in both an RT-only and a CRT setting (Figure 4A). For CRT conditions, two types of normalizations were applied, allowing assessment of synergistic and additive effects of cisplatin and RT (see STAR Methods for more details). In the case of T12, the superior effect of CRT compared with RT alone was due to additive effects rather than the radiosensitizing effect of cisplatin (Figure 4A). These data highlight the complexity of screening organoids for multimodal treatments and underscore the importance of assessing treatment components in combination. Indeed, no clear correlation between organoid and patient response was observed, with $2 / 4$ CRT (cisplatin) patients relapsing but only one of the corresponding organoid models showing resistance, while the other model showed sensitivity (Figure S3C).

## Chemotherapeutics as radiosensitizer HNSCC organoids

The radiosensitizing potential of cisplatin, carboplatin, and cetuximab was assessed in patient-derived organoids. ${ }^{17}$ Organoids were exposed to increasing dosages of RT either in the presence or absence of sublethal doses of the chemotherapeutics. The fixed sublethal concentrations of cisplatin, carboplatin, and cetuximab were chosen based on data from our previous study ${ }^{17}$ (see STAR Methods for more details).

A comparison of the effect of RT in the presence of cisplatin or carboplatin with the effect of RT as a single agent suggested that—overall—the presence of these agents enhanced the effect of RT (synergistic effect; Figures $4 B$ and $4 C$, left panels). In line

Table 2. Statistical analysis of adjuvant RT group
Specification of sensitive/resistance organoid groups $\leq$ median vs. >median based on RT response (log rank test)

| Variable | Median | p value | Interpretation |
| :--- | :--- | :--- | :--- |
| GR50 | $\leq 9.1$ vs. $>9.1$ | 0.01 | GR50 $\leq 9.1$ correlates to later <br> relapseGR50 $>9.1$ correlates to earlier relapse <br> $\leq 84.2 \%$ viability at 2 Gy correlates to later <br> relapse $>84.2 \%$ viability at 2 Gy correlates to <br> earlier relapsedifferences of groups not <br> statistically significant |
| 2Gy | $\leq 84.2 \%$ vs. $>84.2 \%$ | 0.08 | AUCs $\leq 540.8$ and $>540.8$ do not correlate to <br> earlier or later relapse <br> IC50s $\leq 7.7$ and $>7.7$ do not correlate to earlier <br> or later relapse |
| AUC | $\leq 540.8$ vs. $>540.8$ | 0.44 | 0.53 |

Proportional hazards of GR50, 2Gy, AUC, and IC50 on relapse risk (Cox proportional hazard regression)

| Variable | HR (95\% CI) | p value | Interpretation |
| :--- | :--- | :--- | :--- |
| GR50 | $1.24(1.00-1.59)$ | 0.05 | higher GR50 correlates to a higher relapse risk |
| 2Gy | $1.5(0.99-1.12)$ | 0.11 | higher viability at 2 Gy correlates to a higher <br> relapse risk |
| AUC | $1.00(1.00-1.01)$ | 0.58 | no direction of correlation of AUC and relapse <br> risk |
| IC50 | $1.08(0.93-1.23)$ | 0.30 | higher IC50 correlates to a higher relapse risk |
| HR, hazard ratio; Cl, confidence interval. |  |  |  |

with what is observed in the clinic, ${ }^{16}$ both cisplatin and carboplatin served as radiosensitizers. Perhaps unsurprisingly, when compared with untreated organoids, the CRT combination was more toxic to cells than RT alone (additive effects; Figures 4B and 4C, right panels). The added value of these agents differs between cultures derived from different patients. In contrast to the platinum compounds, the presence of EGFR inhibitor cetuximab reduced the effect of RT instead of enhancing the RT effect (first panel, Figure 4D). The effect of RT in the presence of chemotherapy is different (statistically significant) for all three tested chemotherapeutics (Figure 4E). Although both cisplatin and carboplatin enhance the effect of RT (AUC RT[chemo] - AUC RT < 0), cetuximab protects against RT (AUC RT[chemo] AUC RT > 0). These data fit the observed inferior survival of patients treated with cetuximab + RT and highlight the value of organoid models to evaluate combination treatments before implementation in the clinic.

It is important to note that even though cetuximab served as a radioprotector, the in vitro additive effect of RT and cetuximab was still more toxic than that of RT alone for most patient-derived organoid models. (additive effect; Figure 4D, right panel). For all three tested chemotherapeutics, CRT showed more killing than RT alone (Figure 4F).

## Exploring targeted therapies for HNC using organoid models

In HNSCC, targeted therapy implementation has been limited. Beyond cetuximab (and, more recently, immunotherapy), no targeted agents have been approved by the European Medicines Agency (EMA). ${ }^{22}$ However, genetic alterations detected in HNSCC partly overlap with other tumor types for which targeted agents have been approved. For example, the use of PIK3CA inhibitor alpelisib has been approved for use in PIK3CA mutant metastatic breast cancer ${ }^{41}$ but not in HNSCC. To assess the potential of such agents in HNSCC, 31 patient-derived organoid cultures were exposed to drugs targeting molecular pathways known to be affected in

A


B



- AUC RT[chemotherapy]
(in the presence of cis/carbo/Cet)
=normalised to no RT, chemo only)
radioprotector
radiosensitiser
- AUC [RT + chemotherapy] =normalised to no $R T$, no chemo)

C



D



E



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Figure 4. Synergistic vs. additive effects of chemo- and radiotherapy in patient-derived organoids
(A) Relative viability of organoid culture T12 exposed to increasing dosage of radiation ( $1-10 \mathrm{~Gy}$ ) alone or in combination with cisplatin. Error bars represent SEM. Technical replicates: $n=4$ for cisplatin treated and $n=6$ for RT only. Each curve is representative of 2 biological replicate experiments. One-way ANOVA Tukey's multiple comparison test was used to compare RT only vs. RT + cisplatin (synergistic) vs. RT + cisplatin (additive), **p $<0.01$ $* * * p<0.001$. The effect of RT on organoid viability was assessed when given alone or together with chemotherapy. Left: AUC RT expressed relative to AUC [RT + chemo], which expresses the effect of RT on viability in the presence of, but corrected for, a fixed dose of chemotherapy. Green indicates the chemotherapy serves as a radiosensitizer, enhancing the effect of RT. Red indicates the chemotherapy acts as a radioprotector, decreasing the effect of RT. Right: AUC RT expressed relative to AUC [RT + chemo], where viability shows the result of the combinatorial treatment of RT and a fixed dose of chemo. Each dot indicates one organoid line where AUC was calculated by exposing the organoids to 6 dosages of RT in technical triplicate. See also Figures S4A-S4C.
(B-D) Effect of carboplatin (B), cisplatin (C), and cetuximab (D) on RT sensitivity of patient-derived organoids.
(E) $95 \%$ confidence intervals showing AUC RT[chemo] - AUC[RT], thereby indicating the effect the presence of the chemo has on RT sensitivity, where the effect of chemotherapy alone is corrected for. The $x$ axis shows the effect for carboplatin (carbo), cisplatin (cis), and cetuximab (cet), respectively. The outcome of paired $t$ tests is depicted on the right side of the graph. ${ }^{* *} p<0.01,{ }^{* * *} p \leq 0.001, * * * * p<0.0001$.
(F) Identical to (E) except now the y axis indicates AUC [RT + chemo] - AUC [RT], thereby reflecting the effect of RT + chemo without correcting for the effect of the chemo itself. The outcome of paired $t$ tests is depicted on the right side of the graph. ${ }^{* *} p<0.01, * * * p \leq 0.001, * * * * p<0.0001$.

HNSCC (Figure 5A). Only organoids for which tumor identity was confirmed by sequencing were screened. The compounds tested were PIK3CA inhibitor alpelisib, FGFR inhibitor AZD4547, PARP inhibitor niraparib, NRAS inhibitor tipifarnib, protein arginine methyltransferase 5 (PRMT5) inhibitor EZP015666, and mTOR inhibitor everolimus. Organoids derived from different donors showed variable responses to these agents in vitro. For four organoid cultures (T23, T24, T33, and T37) the assay was repeated, showing correlation between biological repeats ( $R^{2}$ average $=0.66$; Figures S4A and S4B).

TP53 mutation status correlated with in vitro Nutlin-3a sensitivity (Figure 5B), ${ }^{34}$ validating our in vitro drug screening platform. This screening response to Nutlin-3a also correlated with the observed effect of a fixed dosage of $10 \mu \mathrm{M}$ Nutlin-3 in culture (see Figure S1D).

Pre-clinical studies have previously identified PIK3CA mutation as a biomarker for alpelisib response. ${ }^{42}$ In clinical trials, a more heterogeneous response to alpelisib treatment was observed. Consequently, the power of this biomarker for HNSCC patients response to alpelisib was questioned. ${ }^{43}$ Considering these clinical findings, we ranked organoids for response to alpelisib based on AUC. PIK3CA mutant models were not signficantly more sensitive to alpelisib than PIK3CA wild-type models (Figures 5C and S4C). This discrepancy between the value of a biomarker when studied either in pre-clinical studies or clinical trials is most likely explained by the (genetic) background of the tumors that can affect drug response. Therefore, we sought to introduce the most common activating PIK3CA mutation (E545K) into HNSCC organoids, thereby generating isogenic cancer organoid pairs differing only by one specific mutation. We introduced single base changes in two patient-derived organoid models using CRISPR base-editing technology. These organoid models (T2 and T3) were chosen as both showed different baseline sensitivity to alpelisib (Figure 5C). Postediting, clonal organoid cultures were genotyped (Figure S4D), and clones carrying the desired PIK3CA mutation were expanded and subsequently tested for alpelisib sensitivity. Compared with their isogenic wild-type counterparts, models carrying PIK3CA mutations showed increased sensitivity to alpelisib (Figure 5D). However, the difference in response between cultures derived from different patients was larger than the difference observed between isogenic pairs (Figure 5E). Indeed, the alpelisib response between both isogenic pairs was not statistically significantly different; however, in contrast, there was a statistically significant difference in sensitivity between T2 and T3 (Figure 5E). These results underscore the potential of organoids to validate the value of a particular biomarker to


Figure 5. Drug screening of patient-derived HNSCC organoids to targeted agents underscores the importance of patient-specific genetic context when validating biomarkers
(A) Response of 31 patient-derived organoid models for seven targeted therapeutic agents. Sensitivity is depicted as the $Z$ score calculated for each individual drug to allow comparison of sensitivities between different drugs. Biological replicates are performed for T23, T24, T33, and T37, which are therefore depicted twice. Red indicates relative resistance, blue indicates relative sensitivity, and gray indicates absence of data. See also Figures S5A and S5B.
(B) Nutlin-3a sensitivity of organoid models relative to their TP53 mutation status. Top row indicates TP53 mutation status determined by sequencing. Red indicates a mutated status, blue indicates a wild-type status, and gray indicates no sequencing data is available. Bottom row: sensitivity to Nutlin-3 depicted as $Z$ score. Color coding: red indicates relative resistance, and blue indicates relative sensitivity.
(C) Alpelisib sensitivity of organoid models relative to their PIK3CA mutation status. Top row indicates the presence or absence of a PIK3CA mutation. Red indicates a PIK3CA mutation was detected, where the specific mutation is indicated by amino acid coding in text. Blue indicates absence of a

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Figure 5. Continued
PIK3CA mutation, and gray indicates absence of sequencing data. Bottom row: sensitivity to alpelsib depicted as $Z$ score. Color coding: red indicates relative resistance, and blue indicates relative sensitivity. See also Figure S5C.
(D) Alpelisib sensitivity of isogenic E545K PIK3CA organoid models, depicted as relative viability to DMSO-treated organoids. Viability is depicted as the average of 3 technical replicates for each concentration of alpelisib tested. Isogenic pairs are indicated by the same color, but a different color shade. See also Figure S5E. Error bars: standard error of the mean.
(E) Alpelisib sensitivity of isogenic E545K PIK3CA organoid models depicted by IC50 value. Each IC50 is calculated from a screen with technical triplicate for 9 concentrations of alpelisib. IC50 was determined in biological triplicate, where each dots represents the result of one experiment. Isogenic pairs are indicated by the same color but a different color shade.
(F) PRMT5-inhibitor sensitivity of organoid models relative to their CDKN2A mutation status. Top row indicates the presence or absence of a CDKN2A deletion. Red indicates a loss was detected, Blue indicates absence of a CDKN2A loss, and gray indicates absence of sequencing data. Bottom row: sensitivity to PRMT-5 inhibitor EZP0001556, depicted as $Z$ score. Color coding: red indicates relative resistance, and blue indicates relative sensitivity.
drug sensitivity in the context of relevant patient heterogeneity. Moreover, organoid cohorts might be useful to identify those patients who are more likely to respond, thereby providing a "second chance" for agents that show positive effects but only in a subset of patients.

Treatment with EZP01556, a PRMT5 inhibitor, ${ }^{44}$ showed differential responses in the panel of organoids screened (Figure 5E). Homozygous loss of methylthioadenosine phosphorylase (MTAP), often co-deleted with CDKN2A has been proposed to serve as a biomarker for response to PRMT5 inhibitors. ${ }^{45-47}$ Indeed, when correlating EZP01556 sensitivity with CDKN2A status in HNSCC organoids, CDKN2A null models showed increased sensitivity to this agent (Figure 5E). In line with our earlier observation in pancreatic cancer cells, ${ }^{48}$ a subset of the CDKN2A proficient models also showed sensitivity to EZP01556.

Taken together, these results revealed a potential treatment option for patients with HSNCC, where over $50 \%$ of cases show loss of CDKN2A. Moreover, these findings underscore the importance of personalized approaches to identify the best drug for each patient. Biomarkers such as CDKN2A status may guide treatments in patient cohorts by identifying those likely to respond but do not hold the power to do this at the individual patient level, as illustrated by the CDKN2A proficient models that also respond to this agent. Functional testing of patient-derived models such as organoids might be better suited to identify such sensitivities for each individual patient.

## DISCUSSION

Molecular diagnostics, where genetic alterations are used to guide patient diagnosis and treatment decisions, is gaining prominence. Novel therapies with selective kinase inhibitors are generally indicated based on the presence of a particular genetic biomarker in the tumor DNA. ${ }^{49,50}$ Although associations between biomarker and drug response are detected at the population level, the presence of the applicable biomarker does not guarantee a response for the individual patient. For example, in patients affected by HER2-amplified metastatic colorectal cancer, only $30 \%-50 \%$ respond to anti-HER2 antibodies. ${ }^{49,51}$ This underscores the importance of better biomarkers to guide patient treatment, ideally on the individual patient level. Here, we explored if patient-derived organoids could be used to better guide patient treatments by serving as a diagnostic tool, using organoid response as the biomarker. Moreover, we explored the value of organoids as a pre-clinical model to test and validate already proposed biomarkers before they enter the clinic.

The potential of organoid models to guide treatment in a personalized manner has been explored before. ${ }^{8,10-12}$ Multiple reviews have described these studies and analyzed their similarities and differences. ${ }^{13,52}$ Overall, correlation between patient
and organoid response is observed. Regardless, these studies investigate different tumor types, disease stages, and treatments and vary in applied methodology to determine organoid sensitivity. Therefore, it is challenging to answer the question of whether organoids can help to guide therapy decisions for all patients with cancer. This is emphasized by a study of Ooft et al. that showed that, in patients with colorectal cancer, organoids can predict patient response to irinotecan-based therapies but not to oxaliplatin and 5-FU. ${ }^{12}$

## Correlation of organoid response and patient response

Here, we have investigated the predictive potential of organoid response to RT and/ or CRT in patients with primary HNSCC. In the adjuvant treatment setting, organoid viability at 2 Gy was the organoid parameter that best correlated with clinical response ( $n=15$; Figure 3C), although the correlation was not statistically significant. For patients that received primary RT, we did not observe a statistically significant correlation between organoid response and clinical relapse ( $n=6$; see Figure S6A). This could potentially be due to the small sample size. Taken together, larger studies are needed to confirm if organoids hold predictive potential.

There are multiple factors that could confound or weaken potential correlation. The first one, applicable in the context of adjuvant RT, is surgery. Even a resistant tumor will not relapse when completely and successfully removed by surgery. Second, the absence of the tumor microenvironment in organoid models should be considered. ${ }^{12}$ RT treatment induces immunogenicity through neoantigen presentation in the tumor microenvironment. ${ }^{53}$ Therefore, the presence of immune cells might be required in a model to assess the full effect of RT. ${ }^{54,55}$ The effect of immune cells on tumor cell killing post-RT or the effects of immunotherapy on regional lymph nodes cannot be assessed in the current screening assay. Indeed, administration of the immune checkpoint inhibitor durvalumab following CRT has been associated with an improved overall survival in patients with stage III non-small cell lung cancer. ${ }^{54,55}$ For HNC, a similar strategy of combined immunotherapy and CRT has not yet shown benefit. ${ }^{55}$

## Measuring organoid response in vitro

Organoid viability was assessed at RT dosage ranging from 1 to 10 Gy . This allowed for calculations of metrics inclduing IC50, AUC, and GR50. Similar to an approach previously used by Yao et al., ${ }^{11}$ organoid viability at a fixed RT dose of 2 Gy was also included as a metric, as 2 Gy is the fraction dose used clinically for patients with HNC. Of assessed metrics, viability at 2 Gy correlated best with clinical response and allowed us to use all organoid models in our analysis (as GR metrics could not be calculated for all organoids due to never reaching $50 \%$ viability). Importantly, using a single dose for readout as opposed to a gradient of dosages ${ }^{11}$ requires less organoids and therefore could decrease time to screening if testing was be applied in a diagnostic setting.

It remains to be determined which parameter is the best predictor of response. In a pooled analysis of 17 oncology organoid studies that assessed organoid response to clinical outcome, the most common parameter of organoid response used was the AUC. ${ }^{13}$ Most informative parameters may depend on treatment type (e.g., RT vs. chemotherapy vs. targeted therapies) as well as the disease type. As more studies evaluating organoid response and clinical response in various oncology indications are reported, this will help to clarify the most optimal parameter per treatment and disease type. For transparency, we have reported IC50, AUC, GR50, and viability at 2 Gy here.

Biomarker validation using patient-derived organoid models
Organoids were used to study the correlation between response to PIK3CA inhibitor alpelisib and the presence of activation PIK3CA mutations. When tested in a cohort of organoid models, no association between PIK3CA mutation status and alpelisib response could be found. We hypothesized that the tumor's genetic background may overrule response to a drug even if the relevant biomarker is present. To test this, E545K mutations were introduced in organoids derived from two different patients using CRISPR-Cas9 base-editing technology. Absolute sensitivity to alpelisib increased upon introduction of the mutation in both cases, and the difference between the two patients remained bigger than the difference between the isogenic pairs. Indeed, in pre-clinical studies, PIK3CA mutation seemed a promising biomarker in HNSCC tumors, but clinical trials yielded disappointing results when selecting patients for alpelisib treatment based on the presence of this biomarker. ${ }^{43}$ These results illustrate how organoid biobanks may be used to validate or characterize biomarkers before they are explored in the clinic to enhance the chance of success of a drug candidate before it enters clinical trials.

Lastly, we used organoids to show that genetic loss of CDKN2A seems to be predictive for a good response to PRMT5 inhibitors. Although it has been shown both preclinically and clinically for other tumor types, ${ }^{45-47}$ to our knowledge, we are the first to show this correlation in HNSCC. These results therefore indicate a new therapy option for HNSCC, which can potentially aid many patients, as $>50 \%$ of HNSCCs show a loss of CDKN2A. ${ }^{33}$

## Limitations of the study

The sample sizes for clinical correlation, primary RT ( $n=6$ ) and adjuvant RT ( $n=15$ ), are small, and therefore results should be interpreted with caution. In the adjuvant RT group, patients' surgery may confound outcome. For clinical analysis, patients' age and sex (ascribed at birth) were collected, but ethnicity and socioeconomic status of patients were not collected. Age and sex distribution of patients included in correlation analysis was comparable to the entire HNC biobank, which is a representative cohort of patients with HNC, as worldwide, the median age for diagnosis is 66 years, and men have a 2 - to 4 -fold higher risk to develop HNSCC. ${ }^{56}$ The study inclusion criteria were patients with HNC with a tumor of minimum 1 cm and a planned intervention with possible tissue collection. Tumors smaller than 1 cm were not suitable for inclusion.

## Conclusions

Here, we present a diverse biobank of organoids derived from patients with HNC that phenotypically and genetically recapitulate the original tissue they are derived from. Organoid response to RT correlates with clinical relapse status in the adjuvant setting but not in the primary setting. Finally, we demonstrate how organoids can be utilized to explore biomarker potential in the setting of targeted therapies, and we identify PRMT5 inhibition as a potential therapy option that can be explored for HNSCC.

## STAR *METHODS

Detailed methods are provided in the online version of this paper and include the following:

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- Kaplan meier analysis
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- Calculation of synergistic and additive effect of radio- and chemotherapy


## SUPPLEMENTAL INFORMATION

Supplemental information can be found online at https://doi.org/10.1016/j.medj. 2023.04.003.

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## AUTHOR CONTRIBUTIONS

R.M., W.W.B.K., and E.D. designed the overall experiments and had unrestricted access to all generated experimental data. W.W.B.K. had the appropriate access to
clinical and patient information. R.M., E.D., R.G., M.H.G., and M.K. performed the organoid experiments. W.W.B.K., E.D., R.M., B.P.d.V., and S.G.E. performed statistical analyses and interpretation. G.J.F.v.S. and E.D. performed WES analysis and interpretation. S.M.W., as a certified head neck pathologist, performed the histological tumor analysis. P.D., C.P.J.R., and M.Z. supported the design and execution of RT experiments and clinical data interpretation. R.d.B., R.J.J.v.E., L.A.D., and S.M.W. supported the clinical study design and interpretation. H.C. and E.D. oversaw the high-level study design, execution, and overall interpretation of data. O.K. oversaw the operations and logistics for tissue sampling and collection. R.M., W.W.B.K., and E.D. wrote the article. All authors read and approved the final article and take responsibility for its content.

## DECLARATION OF INTERESTS

H.C.'s full disclosure is given at https://www.uu.nl/staff/JCClevers/. H.C. is inventor of several patents related to organoid technology, is a co-founder of Xilis, Inc., and is currently an employee of Roche, Basel. E.D. is inventor on a patent related to head and neck organoid technology. R.M. is currently an employee of Roche Products, Welwyn. S.M.W. holds unrestricted research grants from Bayer, Pfizer, Roche, MSD, Amgen, and AstraZeneca, all paid to the UMCG.

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## STAR $\star$ METHODS

## KEY RESOURCES TABLE

| REAGENT or RESOURCE | SOURCE | IDENTIFIER |
| :---: | :---: | :---: |
| Antibodies |  |  |
| anti-Pan Keratin (AE1/AE3/PCK26) Primary Antibody | Roche | Cat\#760-2135; RRID: AB_2810237 |
| Cytokeratin 13 Monoclonal Antibody (AE8) | Thermofisher Scientific | Cat\#\# MA1-5764; RRID: AB_1075159 |
| Transformation-related protein 63 (p63) | Ventana Medical Systems | Cat\#790-4509; RRID: AB_2335989 |
| CINtec® Histology anti-p16INK4a | Roche | Cat\# 705-4793; RRID: AB_2833232 |
| CDX 2, caudal type homeobox transcription factor 2 | Cell Marque | Cat\# 235R-17; RRID:AB_1516803 |
| Anti-alpha-Amylase antibody produced in rabbit | Sigma-Aldrich | Cat\# A8273; RRID:AB_258380 |
| Aquaporin 5 (AQP5) Rabbit Polyclonal Antibody | Origene | Cat\#TA321387; RRID: N/A |
| Phospho-Histone H2A.X (Ser139) Monoclonal Antibody (3F2) | Thermo Fisher Scientific | Cat\# MA1-2022; RRID:AB_559491 |
| Goat anti-Mouse IgG (H+L), Superclonal Recombinant Secondary Antibody, Alexa Fluor™ 488 | Thermo Fisher Scientific | Cat\# A28175; RRID:AB_2536161 |
| Bacterial and virus strains |  |  |
| Competent cells Dh5 alpha | Thermo Fisher Scientific | Cat: 18265017 |
| Biological samples |  |  |
| Primary patient tumor and tumor adjacent material obtained at resection of biopsy performed as start of clinical care |  | N/A |
| Chemicals, peptides, and recombinant proteins |  |  |
| Y-27632 dihydrochloride | Abmole | Cat \# M1817 CAS\# 129830-38-2 |
| A83-01 | Tocris Bioscience | 2939 |
| B27 supplement, 50×, serum-free (Thermo Fisher Scientific, cat. no. 17504-044) | Thermo Fisher Scientific | 17504-044 |
| BSA | Sigma-Aldrich | 10-735-094-001 |
| Caspofungin diacetate | Sigma-Aldrich | SML0425 |
| BME Type 2, RGF Cultrex Pathclear | R\&D Systems | 3533-005-02 |
| CHIR-99021 | Sigma-Aldrich | SML1046 |
| Dispase II protease | Sigma-Aldrich | D4693 |
| Forskolin | R\&D Systems | 1099 |
| N -acetyl-L -cysteine | Sigma-Aldrich | A9165 |
| Nicotinamide | Sigma-Aldrich | N0636 |
| Noggin-Fc fusion protein conditioned medium | U-Protein Express BV | N002 |
| Penicillin-streptomycin | Thermo Fisher Scientific | cat. no. 15140-122 |
| Primocin | Invivogen | ant-pm1 |
| Prostaglandin E2 (PGE2) | Tocris Bioscience | 2296 |
| Recombinant human FGF-10 | Peprotech | 100-26 |
| Recombinant human FGF-2 | Peprotech | 100-18B |
| Recombinant human EGF | Peprotech | AF-100-15 |
| Recovery cell-freezing medium | Invitrogen | 12648-010 |
| RSPO3-Fc fusion protein conditioned medium | U-Protein Express BV | R001 |
| Nutlin-3a | Cayman Chemical | Cat\# 10004372, CAS\# 548472-68-0 |
| rIL-2 | Biological Resource Branch Preclinical Biologics Repository | N/A |
| Cisplatin | UMCU hospital pharmacy | N/A |
| Carboplatin | UMCU hospital pharmacy | N/A |
| Cetuximab | UMCU hospital pharmacy | N/A |
| Mitomycin C | Sigma-Aldrich | M4287-2MG, CAS \#50-07-7 |
| Everolimus | LC Laboratories | Cat\# E4040, CAS\# 159351-69-6 |
| Niraparib | Selleckchem | Cat\#S2741, CAS\# 1038915-60-4 |
| Alpelisib | LC Laboratories | Cat\#A4477, CAS\#1217486-61-7 |
| AZD4547 | ApeXbio | Cat\# A8250, CAS\# 154447-36-6 |
| EZP01556 | Sigma | Cat\# SML1421,CAS\# 1616391-65-1 |

(Continued on next page)

| Continued |  |  |
| :---: | :---: | :---: |
| REAGENT or RESOURCE | SOURCE | IDENTIFIER |
| Tipifarnib | Sigma | Cat\# SML1668, Cas\# 192185-72-1 |
| Opti-MEM | Gibco | 31985062 |
| Critical commercial assays |  |  |
| Reliaprep gDNA Tissue Miniprep System | Promega | Cat\#A5052, N/A |
| Invitrogen ${ }^{\text {TM }}$ Qubit ${ }^{\text {TM }}$ dsDNA HS and BR Assay Kits | Thermo Fisher Scientific | Cat\# 10616763, N/A |
| TaqMan ${ }^{\text {TM }}$ OpenArray ${ }^{\text {TM }}$ Genotyping Barcode Panel 60, <br> QuantStudio ${ }^{\text {TM }} 12 \mathrm{~K}$ Flex plate | Thermo Fisher Scientific | Cat\#4475394 |
| SureSelect ${ }^{{ }^{X T}}$ Target Enrichment System for the Illumina Platform v7 library preparation kit | Thermo Fisher Scientific | N/A |
| CellTiter-Glo 3-D assay | Promega | Cat \#G9681 |
| GoTaq G2 Flexi DNA polymerase kit | Promega | M7805 |
| PureLink PCR Purification Kit | Invitrogen | K3100-02 |
| Quick-DNA microprep kit | Zymo Research | D3021 |
| ddPCR Supermix for Probes without dUTP | Bio-Rad | cat. no \#1863023 |
| ESR1 primer | Bio-rad | dHsaCP100040 |
| Deposited data |  |  |
| WES data, EGA study ID:EGAS00001007076. |  | N/A |
| Experimental models: Cell lines |  |  |
| Patient-derived organoids established from primary patient material |  | N/A |
| Oligonucleotides |  |  |
| 5'-ATCATCTGTGAATCCAGAGGGG-3' | IDT | FW PIK3CA E545K |
| 5'-AGTGTCTGTGTGGGAGAAACAA-3' | IDT | RV PIK3CA E545K |
| 5'-CCGTATCACCAACAGCAGGGTA-3' | IDT | Seq FW PIK3CA E545K |
| 5'-/5Phos/GTTTTAGAGCTAGAAATAG CAAGTTAAAATAAGGC-3' | IDT | PIK3CA_E545 Cloning FW |
| 5'-CTCTCTGAAATCACTGAGCACGGT <br> GTTTCGTCCTTTCCACAAG-3' | IDT | PIK3CA_E545 cloning RV |
| Recombinant DNA |  |  |
| pCMV_AncBE4max_P2A_GFP vector | Addgene | \#112100 |
| AmpR-U6-gRNA expression vector | Addgene | \#47511 |
| Software and algorithms |  |  |
| Bio-rads QuantaSoft Software |  | N/A |
| GraphPad Prism software version 9.3.1 |  | N/A |
| IBM SPSS version 26.0 |  | N/A |
| R version 4.2.2 |  | N/A |
| Benchling |  | N/A |
| Other |  |  |
| Elekta Precise Linear Accelerator 11F49, | Elekta | N/A |
| Electroporator | Nepagene | NEPA21 |
| Multi-drop Combi Reagent Dispenser | Thermo Scientific | 5840300 |
| Digital Dispenser | Tecan | d300e |
| Luminescence detector | Tecan | SPARK |
| Standard tube dispensing cassette | Thermo Scientific | 24072670 |
| D4+ dispense head cassette | Tecan | 30097371 |
| T8+ dispense head cassette | Tecan | 30097370 |
| Glasstic slide with hemocytometer counting grid (Kova International, cat. no. 87144E) | Kova International | 87144E |

## RESOURCE AVAILABILITY

## Lead contact

Further information and requests for resources and reagents should be directed to and will be fulfilled by the lead contact, Rosemary Millen, rosie.millen@roche.com.

## Materials availability

This study generated a biobank of organoids derived from head and neck cancer patients from both tumor and normal tissues, all details of each model are listed in Table S1. Organoids grown from patient tissue can be requested via www. huborganoids.nl. Future distribution of organoids to any third (academic or commercial) party will have to be authorised by the METC UMCU/TCBio at request of the HUB in order to ensure compliance with the Dutch medical research involving human subjects' act.

Data and code availability

- WES data have been deposited at EGA and are publicly available as of the date of publication under study ID: EGAS00001007076. This paper analyzes existing, publicly available data (sequencing datasets of HNSCC) which are cited in the text.
- This paper does not report original code.
- Any additional information required to reanalyze the data reported in this paper is available from the lead contact upon request.


## EXPERIMENTAL MODEL AND SUBJECT DETAILS

## Human subjects

Participants information on age and sex (ascribed at birth) was physician reported and is listed in Tables 1 and S1. Information on gender, socioeconomic status, ethnicity and race/ancestry was not collected.

Both primary and lymphonodular metastatic tumor and adjacent non-malignant tissues were obtained from head and neck cancer patients undergoing tissue biopsy or surgical resection at the University Medical Center Utrecht (UMCU) as part of their routine diagnosis and/or treatment. In addition, blood was drawn in sodium heparin on the day of tissue acquisition. Informed consent was obtained from patients before tissue acquisition, and patients could withdraw their consent at any time. The 12-093 HUB-Cancer protocol used for biobanking has been approved by The Biobank Research Ethics Committee of the University Medical Center Utrecht (TCBio).

The collection of patient tissue and data has been performed in accordance with the guidelines of the European Network of Research Ethics Committees (EUREC) following European, national, and local law. Organoids grown from patient tissue can be requested via www.huborganoids.nl. Future distribution of organoids to any third (academic or commercial) party will have to be authorised by the METC UMCU/TCBio at request of the HUB to ensure compliance with the Dutch medical research involving human subjects' act.

## METHOD DETAILS

## Human specimens

For surgical resection, a small piece of tumor and adjacent non-malignant tissue were sampled after surgery from the resection specimen at the tissue facility of the pathology department. For biopsies, from patients who needed a biopsy for diagnostics an extra biopsy of suspected malignant tissue was taken for this study during the procedure. For all patients, EDTA blood pellets were stored and used for reference DNA isolation (see whole exome sequencing). In addition, blood was drawn in sodium heparin on the day of tissue acquisition.

## Tissue processing for organoid establishment

HNC and normal organoids were generated as previously described. ${ }^{17,52}$ In short, tumor and normal surgical resections and HNC biopsies were collected in Advanced

DMEM/F12 (AdDMEM/F12: Life Technologies, cat \# 12634-034), supplemented with 1x GlutaMAX (Thermofisher; Gibco, cat \# 35050061), Penicillin-streptomycin (Life Technologies, cat \# 15140-122) and 10 mM HEPES (Life Technologies, cat \# 15630-056) (+/+/+ medium) and $100 \mu \mathrm{~g} / \mathrm{mL}$ Primocin (Invivogen, cat \# ant-pm1). Tissue samples were cut into small pieces ( $\sim 1-3 \mathrm{~mm} 2$ ). One to three pieces were collected for DNA isolation (stored at -20 for subsequent DNA isolation), histology (placed in formalin) and tumor infiltrating T-cell (TIL) expansion (see below). The remaining tissue pieces were minced into smaller fragments and digested for 2040 mins by incubating it at $37^{\circ} \mathrm{C}$ in $0.125 \%$ Trypsin (Sigma, cat \# T1426) in +/+/+ medium supplemented with $10 \mu \mathrm{M} \mathrm{Y-27632} \mathrm{(Abmole} \mathrm{Bioscience}, \mathrm{cat}. \mathrm{no}. \mathrm{M1817)}$. 10 mins, mechanical force was used to aid digestion by triturating the tissue pieces with a p1000 pipette. Following incubation, tissue was triturated using a flame-sterilized pipette with a p10 tip on the end. Once pieces of tissue appeared dissociated, +/+/+ medium was topped up to 15 mL and this suspension was filtered through a $70 \mu \mathrm{M}$ filter (Corning, cat \# CLS431751-50EA). Tubes were centrifuged at $300 \mathrm{~g}, 5 \mathrm{mins}$. After centrifugation the supernatant was aspirated and the cell pellet was resuspended in ice-cold $70 \% 10 \mathrm{mg} \cdot \mathrm{mL}-1$ cold Cultrex growth factor reduced BME type 2 (Trevigen, cat \# 3533-010-02) in +/+/+ medium. Organoids in BME were plated in 10-20 $\mu \mathrm{L}$ droplets on the bottom of a pre-heated 48 -well suspension culture plate (Greiner, cat \# M9312). Plates were inverted and incubated at $37^{\circ} \mathrm{C}$ for at least 15-30 mins for the solidification of BME. After solidification, pre-warmed culture medium supplemented with $10 \mu \mathrm{MY}-27632$ and caspofungin $(0.5 \mu \mathrm{~g} / \mathrm{mL}$, Sigma Aldrich) was added to the plates and they were incubated in a $37^{\circ} \mathrm{C} / 5 \% \mathrm{CO}_{2}$ incubator. Two types of culture media were used for HNSCC organoids: HN medium as described previously ${ }^{2}$ or cervical SCC medium (M7) as previously described. ${ }^{32}$ For one organoid culture (T36) derived from an intestinal-type adenocarcinoma, CRC medium was used. ${ }^{3}$

## Organoid culturing and biobanking

Organoids were grown from the primary material in culture media supplemented with $0.5 \mu \mathrm{~g} / \mathrm{ml}$ caspofungin and $10 \mu \mathrm{M}$ Y-27632 for one week. After organoids had formed and were in culture for at least one week, $0.5 \mu \mathrm{~g} / \mathrm{ml}$ caspofungin and $10 \mu \mathrm{M}$ Y- 27632 were removed from the medium. To determine which media was optimal for each organoid line, all primary material was established on HN and M7 medium. The culture was expanded in the media that worked best for that sample. An overview of which culture is grown on which media is provided in Table S1. Medium was changed every two to three days and organoids were passaged between approximately 7 and 14 days after plating, depending on their growth rate.

For passaging, BME droplets with organoids were disrupted by resuspending the well content using a P1000 pipette and transferred to 15 mL Falcon tube, topped up to 15 mL with $+/+/+$ and centrifuged $(300 \mathrm{~g}, 5 \mathrm{~min})$. Pellets were resuspended in $1-3 \mathrm{~mL}$ TrypLE Express (Life Technologies, Carlsbad, CA, USA, cat. no. 12605010 ) and incubated for $3-10 \mathrm{mins}$ at $37^{\circ} \mathrm{C}$. Digestion was closely monitored, by checking the tube under the microscope, and organoids were sheared mechanically using a P1000 pipette with an extra P10 tip placed on the tip, every few mins. After organoids were disrupted into single cells, tubes were topped up using +/+/+ to stop the TrypLE digestion, and centrifuged. Supernatant was removed and cells were resuspended in 70\% BME in +/+/+. Organoid density was always checked under the microscope before plating, if organoids were too dense, more $70 \%$ BME in +/+/+ was added. 10-20 $\mu \mathrm{L}$ domes were plated on pre-heated suspension culture plates (Greiner, cat \# M9312). Plates were inverted and incubated at $37^{\circ} \mathrm{C}$ for at least 15 mins for BME solidification. After solidification, pre-warmed culture medium
supplemented with $10 \mu \mathrm{M} \mathrm{Y}-27632$ was added to the plates and they were incubated in a $37^{\circ} \mathrm{C} / 5 \% \mathrm{CO}_{2}$ incubator. After 2 to 3 days, $\mathrm{Y}-27632$ was removed from the medium and organoids were cultured in media without $Y-27623$ for organoids grown on HN medium, however Y-27632 was constantly in M7 media. Organoids were passaged up to passage 5 , to ensure each organoid culture was capable of robust expansion. During the expansion process and prior to biobanking, a sample of the organoid culture was grown in the presence of $10 \mu \mathrm{M}$ Nutlin-3a. Nutlin-3a was added directly after passage and kept on the cells for two passages to determine TP53 mutational status.

## Biobanking and freezing of organoids

Organoids were biobanked at various passage numbers, with an attempt to freeze multiple vials per passage. As a rule of thumb, at least 1 vial with organoids was frozen at the earliest passage where possible. For each sample at least 5 vials were frozen for biobanking. For freezing, organoids were collected from the culture plates by disrupting the BME droplets using a P1000 pipette, washing with +/+/+ and centrifuging at $300 \mathrm{~g}, 5 \mathrm{~min}$ at $4^{\circ} \mathrm{C}$. Subsequently, supernatant was removed and the pellet was resuspended in Cell Banker 1 (Amsbio, cat \# 11910). 1 mL Cell Banker was used per 1 well of a 12 well plate, with $100 \mu \mathrm{~L}$ BME containing organoids. Organoids were then transferred to cryovials and stored at $-80^{\circ} \mathrm{C}$ for 24 hours, before being transferred to liquid nitrogen for long term storage.

## Thawing organoids

Organoids were removed from liquid nitrogen and placed on dry-ice. Cryovials were placed in the $37^{\circ} \mathrm{C}$ water bath and thawed until a small ice block remained. Organoids were transferred to $10-\mathrm{mL}$ of pre-warmed +/+/+ medium, using a p 1000 pipette in a drop-wise fashion. Tubes were centrifuged at $300 \mathrm{~g}, 5 \mathrm{~min}$ at $4^{\circ} \mathrm{C}$. Supernatant was gently aspirated and pellet was resuspended in $70 \%$ BME in +/+/+. Organoid density was checked under a bright-field microscope. If density was high, more $70 \%$ BME in +/+/+ was added. Organoids were plated in wells of pre-warmed $48-W P$, after $20-30$ mins of incubation at $37^{\circ} \mathrm{C}$, pre-warmed growth medium was added to wells. After 24 hours, organoid viability was checked under a bright-field microscope. If a lot of organoid death had occurred, organoids were harvested, washed (as described above) and replated in fresh BME. Organoids were expanded by passaging at least two times prior to a drug screen.

## DNA isolation

DNA from tissue, organoids and whole blood was isolated using the Reliaprep gDNA Tissue Miniprep System (Promega, Catalogue \# A2052) according to the manufacturer's protocol. For organoid DNA, BME droplets with organoids were disrupted by resuspending the well content using a P1000 pipette and transferred to a 15 mL Falcon tube, topped up to 15 mL with +/+/+ and centrifuged ( $300 \mathrm{~g}, 5 \mathrm{~min}$ ). Supernatant was aspirated and the organoid pellet was frozen and stored at -20 ${ }^{\circ} \mathrm{C}$ for subsequent DNA isolation using the Reliaprep gDNA Tissue Miniprep System (Promega, Catalogue \# A2052) according to the manufacturer's protocol. DNA concentrations were measured using Invitrogen ${ }^{\text {TM }}$ Qubit ${ }^{\text {TM }}$ dsDNA HS Assay Kit (Invitrogen, Cat \# 10616763).

## SNP fingerprinting

DNA ( $5 \mathrm{ng} / \mu \mathrm{L}$ ) isolated from organoids was submitted to USeq (Utrecht Sequencing Facility) along with paired blood and/or tumor tissue from each patient for SNP fingerprinting. There, TaqMan OpenArray Barcode Panel 60, including 57 autosomal and 3 Y-chromosomal SNPs was used to identify SNPs. SNPs were checked
manually by 2 independent researchers to confirm a SNP match between organoid and blood/tissue of the same patient.

## Whole exome sequencing (WES) processing

After confirmation of an SNP match between the organoid and blood/tissue of the same patient, organoid, blood and tissue DNA samples were submitted to Macrogen Europe for WES using the Illumina platform. The SureSelect ${ }^{\mathrm{XT}}$ Target Enrichment System for the Illumina Platform v7 library preparation kit (Agilent Technologies) was used to prepare the sequencing library following the manufacturer's instructions. Libraries were sequenced on an Illumina NovaSeq 6000 system. Illumina software (bcl2fastq) was used to convert to FASTQ format for further analysis.

## Whole exome sequencing (WES) analysis

For the WES analysis, the NF-IAP pipeline (https://github.com/ToolsVanBox/NFIAP) was modified to suit exome data rather than whole genome data. Fastq files were mapped to the human genome (hg38) using bwa mapping software as described in the pipeline. Next, the pre-processing and genotyping of the samples was performed using the Genome Analysis Toolkit (GATK) HaplotypeCaller, with an adapted version of the pipeline (https://github.com/Hubrecht-Clevers/NF-IAP_ exome). Per sample generated variant calls were filtered using the Somatic Mutation Rechecker and Filtering (SMuRF) pipeline (https://github.com/ToolsVanBox/ SMuRF) to filter out likely non-pathogenic mutations and germline variants using default settings and marking the blood derived samples as germline controls. Obtained variant call files were converted to the MAF-format for further analysis using a perl script, converting only mutations with a mean variant allele frequency of above 0.1 and allele depth of $>10$ (https://github.com/Hubrecht-Clevers/Convert_maf). Variants were further characterised using the $R$ package Maftools. Genome wide copy number changes were assessed using an adapted version of the Freec software described in the NF-IAP pipeline (https://github.com/Hubrecht-Clevers/Freec_ exome). Copy number ratios were normalised to either a matched normal control, or, when no matched germline was available, to a technical control of a known germline sample. Data is stored at EGA under study ID: EGAS00001007076.

## Blood processing

Blood was collected in two 8 mL Lithium-Heparin tubes on the day of surgery/biopsy.
Circulating tumor DNA (CtDNA) was isolated within 2 hours of whole blood collection. Lithium-Heparin tubes were centrifuged at $1600 \mathrm{xg}, 10 \mathrm{mins}$, room temperature (RT) with the brake off. Plasma was taken off with a 1000 pipette and 1 mL was transferred to Eppendorf tubes. Eppendorf tubes were then centrifuged at $13,830 \mathrm{xg}$ for 10 mins, RT. Plasma supernatant was collected and stored in 1 mL aliquots at $-80^{\circ} \mathrm{C}$.

Peripheral mononuclear blood cells (PBMCs) were processed at the same time as ctDNA plasma isolation using LymphoprepTM (Stemcell Technologies, catalogue no. 07851) according to the manufacturer's protocol (Stemcell Technologies). PBMCs were stored using Cell Banker 1, as described above.

## Histology and IHC of organoid and tissue sections

A small piece of tumor-tissue or tumor-adjacent normal tissue was fixed using $4 \%$ formalin and incubated at least 24 h on a rocker at room temperature. Subsequently, the material was dehydrated and embedded in paraffin. Organoids were collected after several passages, fixed and embedded in paraffin following the same procedure. Paraffin blocks were cut onto glass slides and subject to $\mathrm{H} \& E$ and IHC staining,
the details of primary antibodies and antigen retrieval conditions used for IHC staining are provided in Table S2. IHC for AE1AE3, CK13, P63, P16NK4a and CDX2 was performed by the diagnostic pathology department at the UMCU using an automated IHC staining system, all according to the manufacturer's protocol. IHC for PAS-D, a-amylase and AQP5 was performed manually. Slides were scanned and imaged using the VS120 virtual slide microscope (Olympus). For a subset of tissues, $H \& E$ sections were assessed by a pathologist to determine tumor percentage and/or epithelial cell percentage. The presence of tumor/epithelial cells was correlated with organoid outgrowth.

## Organoid treatment to induce DNA damage experiments

The organoid line that was established from a patient with Fanconi anemia (T46) was cultured as described above and 5 days later exposed to either: cisplatin ( 5 uM ), Mitomycin-C ( 0.5 uM ) or left untreated for 24 hours. Organoids were harvested with the media in each well, using a pipette to break up the BME droplets and transferred to a $1.5-\mathrm{mL}$ Eppendorf tube pre-coated with FBS. Organoids were left to settle by gravity, and supernatant was removed gently, after which where wholemount immunofluorescence staining was performed as described below.

## $\gamma \mathrm{H} 2 \mathrm{Ax}$ immunofluorescence staining and quantification

Organoids were pre-permeabilized in $0.5 \%$ Triton-X in PBS for 10 mins at room temperature in a 1.5 mL Eppendorf tube. For all washes, organoids were left to sediment in the Eppendorf tube by gravity before removing any supernatant. Organoids were fixed with $4 \%$ formalin for 1 hour at room temperature and permeabilized in PBS with $2 \%$ BSA, $0.5 \%$ Triton-X and $0.2 \%$ Tween- 20 for 1 hour. Organoids were blocked in PBS with $2 \%$ BSA, $0.2 \%$ Triton-X and $0.2 \%$ Tween-20 for 30 mins at room temperature. Organoids were incubated with primary anti-mouse yH2AX antibody (Milipore, catalogue no. 05-635) diluted in a blocking buffer overnight at $4^{\circ} \mathrm{C}$ on a roller. Organoids were washed 4 times with PBS and a secondary goat anti-mouse AF488 (Thermofisher, catalogue no. A28175) was added plus DAPI solution $1 \mathrm{mg} / \mathrm{mL}$ (Thermofisher, catalogue no. 62248) and incubated in the dark for 2-3 hours, at room temperature on a roller. Organoids were washed 4 times and then a mounting medium was added and this was transferred to a glass slide. A raised-coverslip was whole-mounted, using Vaseline to ensure the coverslip did not make full contact with the glass slide. Slides were imaged on the confocal SP8 (Leica) microscope using the DAPI and 488 -channel at 20x and 63x objective. Quantification of the collected images was performed using ImageJ. Images were converted in a RGB stack, threshold was adjusted to 75-225. Images were converted to a mask with watershed. To perform analysis, we used the analyze particles option and counted objects.

## HPV ddPCR

PCR mixture was generated containing 1x ddPCR Supermix for Probes without dUTP (Bio-Rad, cat. no \#1863023) containing 18 pM of previously described HPV primers ${ }^{57}$ and $0.25 \mu \mathrm{M}$ HPV16 FAM-probe, $1 \mu \mathrm{l}$ human ESR1 primer (Bio-rad, assay ID dHsaCP1000403) in a total of $18 \mu \mathrm{~L} .4 \mu \mathrm{l}$ of DNA was added (DNA input concentration ranging from 20 to $100 \mathrm{ng} / \mu \mathrm{l}$ ). PCR mixture was mixed and droplets were subsequently generated using the $\mu \mathrm{I}$ DX200 Droplet generator (Biorad, cat. No. \#186-4002). PCR program used was 10 min at $95^{\circ} \mathrm{C}$ followed by 40 cycles of $30 \mathrm{sec}-$ onds at $94^{\circ} \mathrm{C}$ and one minute at $57^{\circ} \mathrm{C}$. After 40 cycli , the sample was incubated for 10 mins at $98^{\circ} \mathrm{C}$, and stored at $4^{\circ} \mathrm{C}$ until readout. Readout was performed using the QX200 Droplet Reader. Analysis was performed using Bio-rads QuantaSoft Software.

## Drug screening: Preparation and plating

Organoids that were biobanked were thawed and expanded using the methods described above for organoid culture. Two days (D-2) prior to dispensing organoids for drug screening, organoids were passaged and cultured in HNC medium or cervical SCC medium depending on the line and were supplemented with $10 \mu \mathrm{M}$ Y-27632. Organoids growing on HNC medium that were expanded for Cetuximab drug screening were cultured from this point onwards in medium without EGF. On the day 0 (D0) of the drug screen, $1 \mathrm{mg} / \mathrm{mL}$ dispase II (Sigma-Aldrich, catalogue no. D4693) was added to each well containing organoids and their growth medium and incubated for 30 mins at $37^{\circ} \mathrm{C}$. Following incubation, BME domes were disrupted by resuspending the contents of the wells. Material was collected and transferred to 15 mL Falcon tubes. Dispase was diluted by topping up with +/+/+ and centrifuged at $300 \mathrm{~g}, 5$ mins, $4^{\circ} \mathrm{C}$. After removal of the supernatant, pellets were suspended in $10 \mathrm{~mL}+/+/+$ and centrifuged at $300 \mathrm{~g}, 5 \mathrm{mins}, 4^{\circ} \mathrm{C}$. Organoid suspensions were subsequently filtered through 70 um nylon cell strainers (BD Falcon). The number of organoids in the flow through was counted using a KOVA ${ }^{\text {TM }}$ Glasstic ${ }^{\text {TM }}$ Slide 10 with Grids (Fisher-Scientific, catalogue no. 22-270141). Organoids were resuspended at a density of 25,000 organoids $/ \mathrm{mL}$ in $5 \% \mathrm{BME} /$ ice-cold growth medium. Organoids were dispensed in 384-well plates (Corning, catalogue no. 4588) using the Multi-drop Combi Reagent Dispenser (Thermo Scientific, catalogue no. 5840300). Drugs were added using a Tecan D300e Digital Dispenser (see below). Plates were sealed with BreathEasy stickers (Merck, catalogue no. Z380059) and placed in a $37^{\circ} \mathrm{C} / 5 \% \mathrm{CO}_{2}$ incubator that was kept shut until drug screen readout on day 5 (D5).

On Day 0, a CellTiter-Glo 3D (CTG) assay was performed, as described below, for each condition dispensed to determine organoid viability and calculate the Growth Rate metrics over the course of the drug screen. ${ }^{3,12}$

## Drug screening: Chemotherapy dispense

On DO, following organoid dispense into 384 well plate, chemotherapy was dispensed using the Tecan 300e digital dispenser. The chemotherapy agents used were: cisplatin $1 \mathrm{mg} / \mathrm{mL}$ (Accord healthcare limited), carboplatin $10 \mathrm{mg} / \mathrm{mL}$ (Accord healthcare limited) and Cetuximab (Erbitux) $5 \mathrm{mg} / \mathrm{mL}$ (Merck). As these solutions were aqueous, for accurate dispensing with the Tecan 300e digital dispenser, these solutions required the addition of 0.3\% Tween-20 (Merck, catalogue no. P1379) in PBS (Thermofisher, catalogue no. 10010023) prior to dispensing. Four technical replicates of cisplatin at $3 \mu \mathrm{M}$ and $5 \mu \mathrm{M}$, carboplatin at $5 \mu \mathrm{M}$ and $15 \mu \mathrm{M}$ and 5 technical replicates of Cetuximab at $5 \mu \mathrm{~g} / \mathrm{mL}$ and $30 \mu \mathrm{~g} / \mathrm{mL}$ were dispensed. The rationale behind these dosages was to treat with a dose that has an effect, but does not kill all the cells, thereby allowing sufficient test window to study the effect of radiotherapy. Using these criteria, we reviewed drug sensitivity of our previously published panel of organoids treated with these drugs to define the above mentioned concentrations. Staurosporine 1 mM (Merck, catalogue no. 19-123MG) was dispensed at $0.1 \mu \mathrm{M}$, as a positive control for cell death. All other wells received $0.3 \%$ Tween-20 in sterile PBS (solvent-only) as RT-only and negative controls.

For targeted therapy screening, the following drugs were added following organoid dispense:

Nutlin-3a (Cayman Chemical, catalogue no. 10004372), Everolimus (LC Laboratories, catalogue no. E4040), Niraparib (Selleckchem, catalogue no. S2741), Alpelisib (LC Laboratories, catalogue no. A4477), AZD4547 (ApeXbio, catalogue no.

A8250), EZP01556 (Sigma, catalog no. SML1421) and Tipifarnib (Sigma, cat no. SML1668). All drugs were dissolved in DMSO and dispensed from stock concentrations of 10 mM and dispensed in a log-concentration gradient using the Tecan d300e dispenser. All wells were normalized for solvent used. DMSO percentage never exceeded 1\%. Drug exposure was performed in triplicate for each concentration shown.

## Radiotherapy screening

On D1 of the screen, RT plates were irradiated using a linear accelerator (Elekta Precise Linear Accelerator 11F49, Elekta). During irradiation, plates were submerged in water at room temperature with the water level reaching just below the surface of the plate. For each dose, a separate plate was used. Plates were irradiated with a single dose of $1,2,4,6,8$ and 10 Gy , in order to generate a dose-response curve. Dose values were determined according to standard clinical dosimetry procedures. An unirradiated plate ( 0 Gy ) was used as a negative control. To calculate percentage viability, in Microsoft Excel, the CTG signal was normalized against the unirradiated plate as a percentage.

## Drug and radiotherapy screen readout and data analysis

For all organoid screens, organoid viability was assessed using the CellTiter-glo 3D assay ${ }^{\circledR}$ measuring ATP as the signal of organoid viability. After 5 days of initial drug exposure or 4 days of irradiation exposure, organoid viability was measured using the CellTiter-Glo 3-D assay (Promega, catalogue no. G9681) according to the manufacturer's protocol. For this, 20 ul of CTG was added to each well. Luminescence was measured using a Spark microplate reader (Tecan) with an integration time of 500 ms . Data was normalized using a positive control for cell death (Staurosporine $1 \mu \mathrm{M}$, with organoids in $5 \%$ BME in culture medium for $0 \%$ viability) and a negative control (solvent without drugs, with organoids in $5 \%$ BME in culture medium) for $100 \%$ viability. Quality of drug screens were assessed using Z' factor scores, ${ }^{58}$ in which $Z^{\prime}$ scores higher than 0.3 indicate a drug screen of good quality. To calculate $Z^{\prime}$ score:

$$
Z^{\prime} \text { score }=1-\frac{3 * S D(\text { neg. control })+3 * S D(\text { pos. control })}{\text { average(neg. control) }- \text { average (pos. control) }}
$$

As a further measure of quality control, intensity and variation of luminescence signal between wells treated with RT was evaluated by 2 independent researchers. If $Z^{\prime}$ score was $<0.3$, there was a lot of variation between wells and a low luminescence signal was observed; the experiment required an additional repeat. The GR metric was used to calculate GR50 scores. Analysis was calculated in Microsoft Excel and graphs were generated in GraphPad Prism software (version 9.3.1). T tests were performed using GraphPad prism.

## Clinical correlation

Organoids of patients that received RT and/or chemotherapy were suitable for clinical correlation. Relapse data was assessed for each patient treated with RT and CRT. Patients that were only treated with surgery were not suitable for clinical correlation. The following parameters from the patients were collected: Age, gender, cancer type, tumor location, tumor sublocation, TNM-stage, HPV-status, treatment including dates and dosages, surgery dates and relapse data with dates. Clinical outcome was defined as relapse: yes or no. The date of relapse was defined at the first sign of clinical relapse confirmed radiologically or pathologically. When there were no clinical signs of relapse, the radiological or pathological confirmation
date was taken as the relapse date. February $17^{\text {th }} 2023$ was the last day relapse status was recorded for all cases.

## Kaplan meier analysis

The parameters generated from the organoid RT screens included: AUC, IC50, GR50 and the viability of the organoids after 2 Gy of RT and were correlated with clinical outcome. Viability after 2 Gy was used as an organoid parameter to compare with clinical response, as 2 Gy is the fraction dose of RT used to treat HNC patients. For every RT-parameter, the group was divided by the median ( $\leq$ median vs. >median). These two groups were compared in the context of relapse status (Kaplan meier curves Figure 3). Differences between groups were calculated with a Log-rank (mantel-cox) test, if $\mathrm{p} \leq 0.05$ the differences were deemed statistically significant. Follow-up stopped at February 2023. In the analysis the minimum follow-up time of a patient who did not relapse was 502 days.

## Cox regression

For the parameters AUC, IC50, GR50 and viability of organoids at 2 Gy a cox propor-tional-hazards regression with Firth's penalised (partial) likelihood maximisation was executed. Outcomes were Hazard Ratios on relapse.

## Calculation of synergistic and additive effect of radio- and chemotherapy

All tested organoid cultures were exposed to a radiation dose of $1,2,4,6,8$ and 10 Gy as described above. This was done in presence of 3 and $5 \mu \mathrm{M}$ cisplatin, 5 and $15 \mu \mathrm{M}$ carboplatin and 5 and $30 \mu \mathrm{~g} / \mathrm{mL}$ Cetuximab, or in the absence of any chemotherapy. Assay was performed in technical quadruplicate for cisplatin and carboplatin and quintuplicate for Cetuximab conditions. These concentrations were chosen based on sensitivities observed during optimisation of the assay in a panel of patient-derived organoids. For each donor, one dosage of chemotherapy was chosen, following the following criteria:
(1) Viability without RT exposure should be $>70 \%$ (to assure the effect of RT in the presence of the drug can be observed).
(2) If both doses of chemotherapy showed $>70 \%$ viability in the no RT condition, the concentration was chosen that was closest to $70 \%$ viability.
(3) If both doses of chemotherapy showed $<70 \%$ viability in the no RT condition, the lowest concentration was included if viability was $>55 \%$ in the no RT condition. If the lowest concentration showed $<55 \%$ viability, the culture was excluded for the analysis described in Figure 4.

Readout and viability calculations were further performed as above. Only drug screens with $Z^{\prime}$ scores $>0.3$ were included in further analysis. To assess additive effects of chemotherapy and RT, viability was normalised to untreated controls. To assess the synergistic effect of chemotherapy and RT, viability was normalised to the chemotherapy only conditions. This way, the viability represented the effect of RT, in the presence of, but corrected for, the effect of the chemotherapy. This allowed for a systematic assessment of whether the chemotherapy had a radioprotective effect. AUC of each condition was calculated using GraphPad prism v9. Paired t-tests were performed using GraphPad prism v9 to assess whether the effect of RT was significantly different when given in the presence of chemotherapeutics.

## sgRNA cloning and design

The sgRNA to introduce the E545K mutation in PIK3CA was designed using Benchling and subsequently ordered as lyophilised oligos (Integrated DNA Technologies,

IDT). The E545K sgRNA was cloned into an AmpR-U6-gRNA expression vector (a kind gift from Keith Joung, Addgene, \#47511) using a PCR based protocol described by Hu et al. ${ }^{59}$ In short, the sgRNA expression vector was constructed by one-piece blunt-end ligation (T4 ligase) of a PCR product (Q5, NEB) containing the 20-nucleotide sequence corresponding to the sgRNA designed for PIK3CA E545K induction. Plasmids for sgRNA expression were constructed using one-piece blunt-end ligation of a PCR product containing a variable 20-nucleotide sequence corresponding to the desired sgRNA targeted site.

## Electroporation of organoids for DNA delivery

Organoids were disrupted into single cells using TrypLE. Subsequently, cells were resuspended in $90 \mu \mathrm{~L}$ of Opti-MEM medium (Gibco, cat. \# 31985062). $10 \mu \mathrm{~g}$ of the PiggyBac transposon system ( $2.8 \mu \mathrm{~g}$ transposase $+7.2 \mu \mathrm{~g}$ hygromycin resistance containing transposon), ${ }^{60} 7.5 \mu \mathrm{~g}$ of a plasmid containing the $\mathrm{C}>\mathrm{T}$ base editor (pCMV_AncBE4max_P2A_GFP (A kind gift from David Liu, Addgene, \#11210035) and $2.5 \mu \mathrm{~g}$ of the target sgRNA plasmid was added in a total of $10 \mu \mathrm{~L}$ Opti-MEM. Cells and DNA were incubated at RT for 10 min and subsequently electroporated in a electroporation cuvette (BTX, cat. \# 45-0125) on the NEPA21 with settings described by Fujii et al. ${ }^{27}$ After electroporation, $400 \mu \mathrm{~L}$ of Opti-MEM was added and cells were left to recover in the cuvette for 30 mins at RT. Subsequently material was collected and centrifuged. Cell pellet was plated as normal, in $\sim 20 \mu \mathrm{~L}$ drops of $70 \%$ BME. After solidification of the BME, a pre-warmed culture medium containing $10 \mu \mathrm{M}$ RKI Y-27632 was added after 30 mins . The plate was placed in an incubator at $37^{\circ} \mathrm{C}$ and $5 \% \mathrm{CO} 2$ and medium was refreshed every 2-3 days.

## Selection of edited organoids

At least five days after electroporation, and when organoids had reached an average diameter of $>80 \mu \mathrm{~m}, 0.1 \mathrm{mg} / \mu \mathrm{L}$ Hygromycin B-gold solution (InvivoGen, cat. no. ant-$\mathrm{hg}-1$ ) was added to the culture medium. A control well (electroporated with sgRNA but no Cas9) was taken along and selection was continued until all organoids of the control condition had died. On average, this took 10-14 days. The hygromycin-resistant organoids were manually picked from the domes using a brightfield microscope and p20 pipette, and transferred to separate 1.5 mL Eppendorf tubes (Eppendorf, cat. no. 0030120086 ). Addition of $100 \mu \mathrm{I}$ TrypLE allowed passaging of the individual organoids that were sheared, pelleted and resuspended in $50 \mu \mathrm{l} 70 \%$ BME in +/+/+. Of the $50 \mu \mathrm{l}$ cell suspension, $40 \mu \mathrm{l}$ was plated for expansion. the remaining $10 \mu \mathrm{l}$ was stored at $-20^{\circ} \mathrm{C}$ for gDNA isolation (see below). Clones were subsequently expanded using routine passaging conditions until biomass was expanded sufficiently for genotyping, drug screening and biobanking.

## Genotyping of individually picked clones

DNA was collected from the remaining biomass in the tubes used for the first passage of organoids (see above). Tubes were thawed, and DNA was isolated using a Quick-DNA microprep kit (Zymo Research, cat. no. D3021), by adding the lysis buffer directly to the cell pellet. The target regions were amplified with PCR using a GoTaq G2 Flexi DNA polymerase kit (Promega, cat. no. M7805) using 5'-ATCATCTGTGAATCCAGAGGGG-3' (FW) and 5-AGTGTCTGTGTGGGAGAAAC AA-3' (RV). Upon completion of the PCR, the amplified target region was isolated using a PureLink PCR Purification Kit (Invitrogen, cat. no. K3100-02) and sent for EZ-Seq Sanger sequencing (Macrogen) with sequencing primer 5-CCGTATCACCAACA GCAGGGTA-3'. Sanger sequencing analysis was performed using B Benchling alignment software.

## QUANTIFICATION AND STATISTICAL ANALYSIS

Kaplan meier analysis
The parameters generated from the organoid RT screens included: AUC, IC50, GR50 and the viability of the organoids after 2 Gy of RT and were correlated with clinical outcome. Viability after 2 Gy was used as an organoid parameter to compare with clinical response, as 2 Gy is the fraction dose of RT used to treat HNC patients. For every RT-parameter, the group was divided by the median ( $\leq$ median vs. >median). These two groups were compared in the context of relapse status (Kaplan meier curves Figure 3). Differences between groups were calculated with a Log-rank (mantel-cox) test, if $\mathrm{p} \leq 0.05$ the differences were deemed statistically significant. Analysis were executed in IBM SPSS version 26.0. Follow-up stopped at February 2023. In the analysis the minimum follow-up time of a patient who did not relapse was 502 days.

## Cox regression

For the parameters AUC, IC50, GR50 and viability of organoids at 2 Gy a cox propor-tional-hazards regression with Firth's penalised (partial) likelihood maximisation was executed. Outcomes were Hazard Ratios on relapse. Analysis were executed in R version 4.2.2.

Drug and radiotherapy screen readout and data analysis
Quality of drug screens were assessed using Z' factor scores, ${ }^{58}$ in which Z' scores higher than 0.3 indicate a drug screen of good quality. To calculate $Z^{\prime}$ score:

$$
Z^{\prime} \text { score }=1-\frac{3 * S D(\text { neg. control })+3 * S D(\text { pos. control })}{\text { average }(\text { neg. control })-\text { average (pos. control })}
$$

As a further measure of quality control, intensity and variation of luminescence signal between wells treated with RT was evaluated by 2 independent researchers. If Z' score was $<0.3$, there was a lot of variation between wells and a low luminescence signal was observed; the experiment required an additional repeat. The GR metric was used to calculate GR50 scores. Analysis was calculated in Microsoft Excel and graphs were generated in GraphPad Prism software (version 9.3.1). T tests were performed using GraphPad prism.

## Calculation of synergistic and additive effect of radio- and chemotherapy

To systematically assess whether the chemotherapy has a radioprotective effect. AUC was calculated using GraphPad prism v9. Paired t-tests were performed using GraphPad prism v9 to assess whether the effect of RT was significantly different when given in the presence of chemotherapeutics.


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