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## Characterization of the immune response in patients with cancer of the oral cavity after neoadjuvant immunotherapy with the IRX-2 regimen

Siyu Liu<sup>1</sup>, Emily Bellile<sup>2</sup>, Ariane Nguyen<sup>3</sup>, Katie Zarins<sup>4</sup>, Laura Rozek<sup>4,\*</sup>, Gregory T. Wolf<sup>3,\*</sup>, Maureen Sartor<sup>1,2,\*</sup>, INSPIRE Trial Clinical Investigators

<sup>1</sup>Department of Computational Medicine and Bioinformatics, University of Michigan, Ann Arbor, Michigan, USA

<sup>2</sup>Department of Biostatistics, University of Michigan, Ann Arbor, Michigan, USA

<sup>3</sup>Department of Otolaryngology-Head and Neck Surgery, Michigan Medicine, Ann Arbor, Michigan, USA

<sup>4</sup>Department of Environmental Health Sciences, University of Michigan, Ann Arbor, Michigan, USA

## Abstract

**Objective**—IRX-2 is a homologous cell-derived multi-cytokine biologic with multifaceted immune modulatory effects that has been shown to induce increased lymphocyte infiltration into primary tumors in oral cavity carcinoma. Our objective was to characterize tumor immune gene expression and epigenomic changes after neoadjuvant IRX-2 immunotherapy in patients with squamous cell carcinoma of the oral cavity.

**Methods**—A randomized phase II trial was conducted of the IRX regimen 3 weeks prior to surgery for previously untreated patients with Stage II-IV oral cavity carcinoma. The treatment regimen consisted of low dose (300mg/m2) cyclophosphamide (day 1) followed by 10 days of regional perilymphatic IRX-2 cytokine injections and daily oral indomethacin, zinc and omeprazole (Regimen 1) compared to the identical regimen without the IRX-2 cytokines (Regimen 2). The NanoString immune panel (730 genes) and Infinium MethylationEPIC BeadChip were performed to assess the gene expression and DNA methylation signatures, respectively, in pre- and post-immunotherapy tumor samples.

**Results**—A total of 51 and 79 immune-related genes were found upregulated and downregulated, respectively, in the samples from Regimen 1 patients after treatment, while 51 and 56 were found upregulated and downregulated in the samples for Regimen 2. When comparing the changes between the two regimens, we identified 9 genes significantly different, including DMBT1, a potential tumor suppressor, functioning in tumor invasion of head and neck cancer. The exploration of DNA methylation showed slight overall hypermethylation after treatment in

<sup>&</sup>lt;sup>\*</sup>**Corresponding authors:** To whom correspondence should be addressed: Laura Rozek, Address: 1415 Washington Heights, Ann Arbor, MI 48109; rozekl@umich.edu; Gregory Wolf, Address: 1903 Taubman, Box 5312, Ann Arbor, MI 48109; gregwolf@med.umich.edu; Maureen Sartor, Address: 100 Washtenaw Ave, Ann Arbor, MI 48109; sartorma@umich.edu.

both regimens, especially for Regimen 1 immune responders, and methylation-based cell type deconvolution demonstrated high concordance with tumor infiltrating T lymphocyte cell counts.

**Conclusion**—While a consistent patient response after treatment was observed, most changes were similar between regimens, indicating a subtle, targeted, or patient-specific effect of IRX-2 cytokines. Change in DMBT1 expression was a unique finding that will require further study to better understand its significance.

#### Keywords

Immunotherapy; Oral cavity carcinoma; Neoadjuvant; NanoString; Tumor infiltrating lymphocytes; Cytokine

## Background

Head and neck squamous cell carcinoma (HNSCC) is the sixth most prevalent cancer worldwide, affecting approximately 680,000 patients annually(1,2). Traditional treatment of HNSCC involves a combination of surgery, radiotherapy and/or chemotherapy, and the five-year survival rate ranges from 55% to 66%(3). Immunotherapy with immune checkpoint inhibitors (ICI) has shown revolutionary progress in the treatment of multiple cancers. The PD-1/PD-L1 pathway is a key mechanism targeting T cell regulatory functions to enhance anti-tumor immune response(4), and PD-1 inhibitors pembrolizumab and nivolumab showed clinical advances in recurrent and metastatic HNSCC patients. However, the overall response rate for pembrolizumab is only 16% to 18% regardless of human papillomavirus (HPV) status(5,6), while patients treated with nivolumab have demonstrated significantly longer overall survival than those treated with standard single-drug systemic therapy(7). The challenge remains to discover how to increase these encouraging response rates and clinical results with novel immunotherapy approaches.

IRX-2 is a biologic product that contains multiple cytokines derived from normal donor phytohemagglutinin (PHA) stimulated mononuclear cells. The primary active components in IRX-2 are IL2, IL1 $\beta$ , IFN $\gamma$  and TNF $\alpha$ . Previous studies showed that IRX-2 can protect T cells from activation-induced cell death and promote the cytolytic functions of natural killer cells(8). In addition to the direct effects of IRX-2 on antitumoral immunity, IRX-2 could potentially prime the tumor for positive response to ICIs. In a completed Phase 2a clinical trial in patients with oral carcinoma, IRX-2 immunotherapy was associated with increased immune infiltration and chemokine receptor expression using multiplex immunohistochemistry (IHC) and transcriptome analysis from 7 matched pre- and posttreatment tumor specimens(9).

Apart from the expression of immune response genes, methylation changes also play an important role in cancer immunotherapy. Hypermethylation at CpG islands and promoters together with global hypomethylation have been documented in HNSCC (10–12). In particular, hypomethylation of human retroelement long interspersed nucleotide element-1 (LINE-1) was associated with higher risk of oral cavity cancer (OCC) relapse, and is a potential predictive biomarker for OCC(13,14). In recent immune-related HNSCC studies, the characterization of DNA methylation profiles predicted a combination of hyper- and

hypo-methylation markers in response to ICI, and these methylation signatures could act as surrogate biomarkers to predict responsiveness to PD-1/PD-L1 inhibition(15–18). In addition, accompanied by genomics data, a methylation-based cell type deconvolution approach may distinguish "immune hot" from "immune cold" HNSCCs(19).

Based on promising findings from a prior Phase 2a trial, we studied immune-related gene expression and genome-wide DNA methylation in tumor specimens from a larger scale randomized Phase 2b clinical trial. The trial was designed to determine whether IRX-2 cytokines increase lymphocyte infiltration into primary tumors and how these cytokines are active in previously untreated patients with Stage II-IV OCC undergoing definitive resection (NCT 02609386). The IRX-2 regimen started 3 weeks prior to surgery, consisting of an initial dose of cyclophosphamide (300 mg/m2) followed by 10 days of regional perilymphatic IRX-2 cytokine injections and daily oral indomethacin, zinc and omeprazole (Regimen 1). The control regimen was identical to Regimen 1 without the IRX-2 cytokine injections (Regimen 2). A total of 96 patients were randomized 2:1 to Regimen 1 or Regimen 2 (64:32). To determine the effect of IRX-2 on immune gene expression, a paired transcriptome analysis (NanoString) was conducted on pre- and post-treatment tumor samples from 71 patients. In addition, DNA methylation EPIC BeadChip was conducted on a subset of patients to explore the DNA methylation profiles of patients in both arms before versus after treatment.

## Methods

#### NanoString data analysis

Seventy-one patients out of 96 had usable Nanostring data available both before and after immunotherapy. The expression data were code-count normalized, sample content normalized, and background corrected using the *NanoStringNorm* R package (20). Paired tests with edgeR-QLF were used to conduct two types of differential analysis: before vs after treatment for each regimen separately, and a contrast between the change in Regimen 1 versus the change in Regimen 2. Significantly differentially expressed genes had false discovery rate (FDR) < 0.05 and fold change > 1.5.

### EPIC BeadChip data analysis

MethylationEPIC BeadChip assay data (Illumina, San Diego, CA) were analyzed for 24 patients with both biopsy and resection samples. Raw data were pre-processed with functional normalization *funnorm*(21). A total of 17611 probes were removed due to detection failurein at least 5% of samples. After dropping cross-reactive probes detected in 450K BeadChip and probes that map to X and Y chromosomes, 777406 probes were used for the remainder of analysis. Linear regression and *eBayes* function in the *limma* R package were used to call DMPs (differential methylated probes, with methylation difference > 10% and FDR < 0.05) before versus after treatment in a paired analysis for each regimen, however no probes were significantly different. The R package *DMRcate*(22) was used to call potential DMRs (differentially methylated regions, with FDR < 0.05 and methylation change > 10%) from DMPs.

#### Determination of response to neoadjuvant immunotherapy

Two types of response to treatment were calculated for each patient having the relevant data: clinical tumor response and immune response based on the change in T cell counts in the tumor microenvironment (Table 1). Clinical response was categorized as partial response (PR), stable (SD), or progressive disease (PD) based on RECIST (Response Evaluation Criteria in Solid Tumors) criteria, evaluated from unbiased centralized independent interpretation of CT and/or MRI scans (Parexel Informatics). Immune responders (IR) were defined as having an increase in CD8+ TIL (tumor infiltrating lymphocytes) infiltrate score of at least 10 cells/mm<sup>2</sup>, as previously published(23).

#### Additional analyses

Detailed analytic methods for the (1) Phase 2b clinical trial; (2) tumor sample preparation; (3) DNA extraction and EPIC BeadChip protocol; (4) RNA extraction and NanoString protocol; (5) DNA methylation-based cell type deconvolution are available in Supplementary Methods.

#### Results

#### Both regimens resulted in a differential pattern of immune gene expression

From 2016 to 2018, we collected clinical data and tumor specimens from a total of 96 patients with newly diagnosed OCC who participated in the neoadjuvant Phase 2b clinical trial with IRX-2 regimen. To determine the effect of IRX-2 on immune response, we captured the expression level of 730 immune response genes on 71 patients for paired biopsy (3 weeks prior to surgery) and surgical resection (after 21 days of immunotherapy) specimens (Table S1).. First, to understand the degree of heterogeneity based on signatures in our cohort, principal component analysis (PCA) was used. Although the samples did not separate by regimen, a major source of heterogeneity was the distinction between biopsy and resection, suggesting treatment induced immune response change in both regimens (Figure S1A). By using the log<sub>2</sub> fold change (FC) of resection versus biopsy samples, we did not observe any separation based on regimen, immune response, or clinical response (Figure S1B).

By comparing the baseline (biopsy) to resection, we elucidated changes in key immune response genes. A total of 51 and 79 immune response genes were found upregulated and downregulated, respectively, in the resection samples of Regimen 1 patients, while 51 and 56 were found upregulated and downregulated, respectively, in the resection samples of Regimen 2 patients. Among these differentially expressed genes, 69 overlapped between the two regimens, with 33 upregulated and 36 downregulated in resection (Figure 1A). Some of these overlapping upregulated genes have been previously linked with mutations in cancer, including *CD63*, *BCL2*, *MME1*, *DMBT1*, and *CXCL12*, while the overlapping downregulated cancer genes include *S100A7*, *HRAS*, *MST1R*, *CDH1*, and *IL1B*. A complete list of differentially expressed genes in each regimen are listed in Table S2. Noticeably, *CD8A*, a gene marker for CD8 T cells, was only upregulated in Regimen 1.

To visualize the expression patterns of upregulated and downregulated genes in both regimens, we performed hierarchical clustering on the union of differentially expression genes in Regimen 1 and Regimen 2 (Figure 1B). The resulting heatmap separated up and downregulated genes, except for a few patients whose gene expression consistently decreased after treatment for nearly all genes. Interestingly, while the upregulated genes demonstrated a consistent pattern across patients in both regimens, the downregulated genes were due to large decreases in a subset of patients irrespective of regimen. No clear distinctions were observed between the two regimens or between the two immune response groups.

#### Higher DMBT1 upregulation after treatment in Regimen 1 than Regimen 2

Comparing the changes between the regimens, we identified 9 genes which displayed significantly different changes between the regimens (Figure 2A). Of these genes, six (*DMBT1, SEMG1, CD160, CCR9, CCL16, IL2*) were associated with a larger change between biopsy and resection samples in Regimen 1, while the changes in Regimen 2 were larger for *KIR3DL2, IFNA7* and *CTAG1B*. Only *DMBT1* was upregulated in both regimens. The only gene that showed previous mutations in HNSCC was *DMBT1*, a potential tumor suppressor gene functioning in interaction between tumor cells and immune system, as well as invasion in HNSCC(24,25). The average increase in *DMBT1* was 59.3-fold in Regimen 1 versus 19.43 in Regimen 2 (Figure 2B). Visualizing individuals' *DMBT1* expression across response groups, we did not observe a strong association between change in *DMBT1* expression level and either clinical tumor response (Figure S2) or immune response (Figure 2B) in either regimen. However, this conclusion was limited because few patients with NanoString data were characterized as clinical responders (n=4), and only 26 patients had immune response information available, with only three immune responders in Regimen 2.

#### Change in immune signature after treatment

To study the effect of IRX-2 treatment on key immune signatures, the change in expression of PD1 and PDL1 in both regimens was assessed. Expression levels of both PDL1 (*CD274*) and PD1 (*PDCD1*) revealed large individual variability (Figure 3). The differential expression analysis between biopsy and resection revealed downregulation of PDL1 after treatment in Regimen 2; this drop in expression was concentrated in non-immune responders. Patients characterized as immune responders showed little to no change in either gene in either regimen.

Beyond PD1 and PDL1, we examined per patient changes in interferon, cytokine, antigen and inflammation gene groups, which were defined in Li et al.(26) and identified as being important in immune response of epithelial cancers. Overall, we observed a high level of variability among patients, yet 25% of the genes were differential expressed between biopsy and resection in both Regimen 1 and Regimen 2 (Table S3). After separating patients by respective regimen and immune response, we discovered that the changes in interferon and antigen genes were more subtle in the immune responders of Regimen 1 than Regimen 2 and non-responders, but this trend was not as prominent for cytokine or inflammation genes (Figure S3A-D). Although a definitive conclusion is difficult due to the existence of a few outlier patients with extremely large downregulation, we found that 62% and 75% of Regimen 1 immune responders had increased cytokine and inflammation gene expression; only 1 of 3 Regimen 2 immune responders had a similar increase.

#### Higher methylation level after treatment in both regimens

DNA methylation was assessed using the MethylationEPIC BeadChip assay on 24 patients (14 in Regimen 1 and 10 in Regimen 2), to explore the changes in DNA methylation caused by IRX-2. The overall global methylation distribution results showed a slight overall increase in methylation after treatment in both regimens, and this increase was consistent across CpG islands, shores and shelves (Figure S4). The same trend was especially prominent on the LINE-1 and LINE-2 elements of Regimen 1 compared to Regimen 2 and was mainly due to the immune responders in both regimens (Figure 4A). Since the focus of this study was on the effect of IRX-2 on immune response, we also looked at the methylation level of the CpGs that fall on the promoter regions of immune response genes. In Regimen 1, the methylation level increase after treatment was more prominent in immune responders, which was not observed in Regimen 2 (Figure 4B).

## Altered methylation of immune response and keratinization pathways

By comparing methylation profiles before versus after treatment, we did not identify any differentially methylated probes (DMPs) in either regimen. However, testing differentially methylated regions (DMRs), we identified 523 and 1 potential hyper and hypo-methylated regions in the resection samples of Regimen 1 respectively, including those mapped to immune response genes IFI27 and SPINK5 which were downregulated after treatment based on NanoString data (Table 2). Conversely, a total of 721 and 112 potential regions were found to be hyper- and hypo-methylated respectively in the resection samples of Regimen 2; of genes with potential hypermethylation, CXCL14, CLEC5A, LAMP3, TOLLIP and *IFITM1* displayed downregulation. A total of 21 potential DMRs were hyper-methylated in both regimens, including keratinocyte differentiation gene RIPK4, but none of the overlapped genes were among the immune response genes selected for NanoString. Pathway enrichment of the DMRs suggested cornification, keratinization, and epidermic development and differentiation were enriched with hypermethylation in Regimen 1 (Figure S5A). For Regimen 2, enrichment pathways including organ morphogenesis, epithelium development and embryonic development were most significant, but not keratinization or cornification (Figure S5B).

# Lower percentage of cancer cells and higher percentage of T cells after treatment for immune responders

Cell type deconvolution analysis using bulk gene expression or DNA methylation data has become an important tool for interpreting changes in light of potential shifts in cell type proportions. Recently, it was shown that cell type deconvolution is more accurate using DNA methylation data than gene expression data (19). Due to the uncertainty in defining immune responders based on any one criterion, cell type deconvolution provides a complementary perspective. To determine the effect of IRX-2 treatment on cell type proportions in each regimen, we performed deconvolution with MethylCIBERSORT on 48 samples (28 in Regimen 1 and 20 in Regimen 2) with DNA methylation data, estimating the proportions of 11 cell types (see Supplementary Methods). None of the cell types were

significantly different either between the two regimens or between biopsy and resection samples. However, we observed decreased cancer cell proportions as well as increased CD8+ T cell proportions in immune responders of Regimen 1, which was not replicated in non-immune responders or Regimen 2 patients (Figure 5A). The cell type deconvolution results for CD8+ T cells were confirmed by the high correlation between the estimated CD8+ T cell proportion from MethylCIBERSORT and the CD8+ T cell density counts performed previously on tissue microarrays(23) (Figure 5B).

## Discussion

Our study is the first to characterize immune-related gene expression and DNA methylation profiles after neoadjuvant immunotherapy with the IRX-2 regimen in a randomized clinical trial. We identified expression changes in immune response genes after treatment with both regimens. Surprisingly, the differential expression pattern was similar in Regimen 1 and Regimen 2, with more than half of the differentially expressed genes in common between the two regimens, suggesting much of the action in the tumor microenvironment (TME) of the complete IRX-2 treatment protocol is due to elements other than the cocktail of cytokines directed at the regional lymph nodes. For example, one cytokine component in IRX-2, IL1B, was downregulated after both regimens. However, the IL2 cytokine component, showed more significant change between biopsy and resection samples for Regimen 1 patients (Figure 2A), indicating a potential linkage between IRX-2 treatment and higher activated CD4+ T cells and activated CD8+ T cells, major sources of IL2 in the TME(27). DMBT1 (deleted in malignant brain tumor 1) is a potential tumor suppressor gene encoding a pattern recognition molecule that plays a key role within the innate immune system(28,29). Uniquely, DMBT1 was found to have more extensive upregulation in Regimen 1 than Regimen 2. Previous studies confirmed the critical role DMBT1 plays in the interaction of tumor cells and the immune system, and downregulation of *DMBT1* is thought to promote invasion in head and neck cancer(24,25), which could suggest modulation of tumor invasiveness after IRX-2 treatment in Regimen 1 in our study. However, follow-up studies are needed to further understand the downstream effects of DMBT1 upregulation in patients with OCC and the results reported here are in a limited number of patients.

Cyclophosphamide, a component of both regimens, slows cancer growth by inhibiting protein synthesis and can suppress regulatory T cells with a single low dose(30). Indomethacin and zinc are also known immunomodulators. Given the complexity of the complete IRX-2 regimen and unknown interactions among its components, it is difficult to predict *a priori* the effects it has on PD1 and PDL1 expression. In our study with only limited numbers, we did not observe a clear distinction based on PD1 and PDL1 changes in the TME between the two regimens, and in fact the PD1 and PDL1 levels remained relatively stable for immune responders in Regimen 1 suggesting that the effect of IRX-2 cytokines likely differs from traditional checkpoint inhibitors and might help reconstitute the immune response by stimulating T cell infiltration. Further, our measures did not specifically differentiate between tumor and immune cell expression of these biomarkers. However, both PD1 and PDL1 expression dropped in Regimen 2, particularly for non-responders and for non-responders in Regimen 1, which is consistent with an effect on PD-1 blockade(31) suggesting that such effects might not be clinically beneficial. In

prior work we noted increases in CD68 tumor associated macrophages associated with IRX Regimen 2 which would be consistent with such a negative effect(23). Interacting factors makes clear interpretations difficult, however the lack of toxicity also makes IRX-2 an attractive approach combined with other immune modulators.

Utilizing the DNA methylation data, we were able to identify an increase in global methylation levels after treatment in both regimens, with a more prominent trend in responders of Regimen 1 and in LINE repetitive elements. Since global and repetitive element hypomethylation is common across cancer types, this increase is shifting the tumor's methylation status closer to "normal". Other publications also report the potential importance of PD1/PDL1 methylation in the prognosis of HNSCC patients(15,32), however we did not observe any significant methylation change in or near PD1 or PDL1. Pathway enrichment analysis with the DNA methylation data revealed pathways linked with hypermethylation after treatment in Regimen 1, including cornification, keratinization and epidermic development, which could point to a change in the differentiation status of tumors(33,34). Although our immune-focused NanoString data did not allow us to assess keratinization gene changes, this could be a counterpoint to the benefit of IRX-2 worth studying, since low keratinization has been associated with higher recurrence rates and lower 5-year survival rates in oral cancer patients(35).

Previously, our group published the preliminary findings of this phase2b clinical trial that Regimen 1 resulted in higher levels of CD8+ T cell density post-treatment than did Regimen 2(23). Our study reconfirms this finding based on significant CD8 markers' gene expression (*CD8A* and *IL2*) in Regimen 1 only and on methylation-based cell type deconvolution. However, our analysis also suggested that most of the observed immune pattern changes beyond this and the PD1/PDL1 findings, did not significantly differ by regimen. The main potential benefit of IRX-2 has been thought to be increased activation and migration of T cells from the regional lymph nodes into the tumor microenvironment. Direct effects of the cytokine preparation on the primary tumor would not necessarily be expected unless they are mediated by changes in TILs. Our current study focused on changes in the tumor microenvironment rather than T cells, therefore the lack of major changes in gene expression or methylation is not surprising. We found general changes associated with both immune modulating treatment regimens that probably reflect the non-cytokine components of the regimens but also encouraging findings that confirmed the T cell density counts previously reported with Regimen 1.

A limitation of our study is the inconsistent availability of different data types. Ninety-six patients were enrolled in the Phase 2b clinical trial, whose clinical characteristics and survival information were collected in a prospective manner. Correlations of our findings with patient survival are currently awaiting further follow-up. However, only 71 patients had data sufficient for gene expression analysis, and only a subset of those (24) had DNA methylation analysis. Only 26 patients had CD8+ T cell density measured for determining immune responder status, and clinical tumor response was only available for 77 patients, resulting in missing response data in a large percent of patients with gene expression or DNA methylation data. With gene expression analysis limited to NanoString instead of full

RNA-seq, our study also lacked the ability to study expression of other important pathways such as keratinization and differentiation status.

## Conclusion

Future studies with larger sample size and more complete data will provide a more comprehensive picture and a better understanding of the effects of IRX-2 treatment and help in selecting patients most suitable for immunotherapy. As one of the first studies to capture the genetic and epigenetic effects of neoadjuvant immunotherapy with the IRX-2 regimen, we conclude that the cytokine components of IRX-2 have definite but subtle effects on patient immune response, and that some of the effects of the complete IRX-2 treatment are due to the non-cytokine components. Specific benefits in the tumor microenvironment of the cytokine cocktail in IRX-2 remain undefined, but our findings in this very limited study are consistent with increases in CD8+ T cell density, modest global and repetitive element re-methylation of the genome, upregulation of the tumor suppressor *DMBT1*, and unchanged PD1/PDL1 for the subset of patients showing immune cell infiltration.

## Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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#### **Conflict of Interest**

Dr. Wolf was a recipient of grant funding from the clinical trial sponsor, Brooklyn ImmunoTherapeutics, for central laboratory tissue collection and correlative immune studies. Dr. Wolf also serves on the Scientific Advisory Board for Brooklyn ImmunoTherapeutics, Inc.

## Appendix

## Appendix

Members of the INSPIRE Trial Clinical Investigators include: <sup>1</sup>Jeff Moyer, <sup>2</sup>Mihir Patel, <sup>3</sup>Audrey Erman, <sup>4</sup>Wanessa A. Martins, <sup>5</sup>Jason Newman, <sup>6</sup>Michael Kaplan, <sup>7</sup>Frabicio Oliveira, <sup>8</sup>Ana Paula Victorina, <sup>9</sup>R. Bryan Bell, <sup>10</sup>Gustavo C. Girotto, <sup>11</sup>Jorge Nieva, <sup>12</sup>Joseph Valentino, <sup>13</sup>Greg Krempl, <sup>14</sup>Claudio R. Cernea, <sup>15</sup>Dennis Kraus, <sup>16</sup>Kevin Higgins, <sup>17</sup>Felipe JSM Cruz, <sup>18</sup>Aru Panwar, <sup>19</sup>Clodoaldo Z Campos, <sup>20</sup>Jim McCaul <sup>1</sup>University of Michigan, Ann Arbor, MI <sup>2</sup>Emory University Winship Cancer Institute, Atlanta, GA; <sup>3</sup>University of Arizona Medical Center, Tucson, AZ; <sup>4</sup>Instituo Goiano de Oncologia e Hematologia, Brazil; <sup>5</sup>Hospital of the University of Pennsylvania, Philadelphia, PA; <sup>6</sup>Stanford University Medical Center, Stanford, CA; <sup>7</sup>Hospital Erasto Gaertner/Liga Paranaense de Combate Cancer, Brazil; <sup>8</sup>Instituto Nacional do Cancer, Brazil; <sup>9</sup>Providence Cancer Center, Providence, RI; <sup>10</sup>Hospital de Base de Sao Jose do Rio Preto, Brazil; <sup>11</sup>University of Southern California, Los Angeles, CA; <sup>12</sup>University of Kentucky Medical Center, Lexington, KY; <sup>13</sup>University of Oklahoma Health Sciences Center, Oklahoma City, OK; <sup>14</sup>Instituto do Cancer do Estado de Sao Paulo; <sup>15</sup>Northwell Health Lenox Hill Hospital, New York, NY; <sup>16</sup>Sunnybrook Research Institute, Toronto, CA; <sup>17</sup>Instituto Brasileiro de Controle ao Cancer; <sup>18</sup>University of Nebraska Medical Center, Omaha, NE; <sup>19</sup>Hospital do Cancer de Londrina, Brazil; <sup>20</sup>Queen Elizabeth University Hospital, Glasgow, UK.

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## Highlights:

- First study to capture transcriptomic and epigenomic effects of IRX-2 immunotherapy
- Both neoadjuvant regimens resulted in significant immune expression profile changes
- Methylation-based cell type deconvolution captured CD8+ T cell density changes

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## Figure 1:

Immune response genes changed similarly in both Regimen 1 and Regimen 2. (A) Venn diagrams showing the total number of differentially expressed genes, the number of upregulated genes, and the number of downregulated genes after treatment that are overlapped between Regimen 1 and Regimen 2, respectively. (B) Heatmap showing the log<sub>2</sub> fold change of gene expression before versus after treatment (log2FC, resection/biopsy) of all 153 differentially expressed immune genes in either regimen. Samples are ordered in columns by regimen and immune responder status, and hierarchical clustering was performed on genes only, which are displayed as rows.

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#### Figure 2:

A total of 9 genes showed significantly different changes after treatment between the two regimens. (A) Heatmap showing the log<sub>2</sub> fold change (resection/biopsy) of the 9 genes whose difference before vs after treatment is significantly different between Regimen 1 and Regimen 2. (B) Box plot of the DMBT1 gene expression at biopsy and resection in the two regimens separately. Spaghetti plot showed the change of DMBT1 expression in patients of different immune response groups.

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### Figure 3:

The expression levels of CD274 (PDL1) and PDCD1 (PD1) in patients (A) with and (B) without immune response groups of the two regimens.



#### Figure 4:

The average DNA methylation levels in both regimens at (A) LINE-1 and LINE-2 elements and (B) immune response gene promoters.

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### Figure 5:

Cell type deconvolution using DNA methylation data revealed higher CD8 in immune responders of Regimen 1. (A) Bar plot showing the proportion of different cell types from 48 patients in different immune response groups. (B) Dot plot indicating the correlation between MethylCIBERSORT CD8 proportion and TMA density (r = 0.51), and the correlation between MethylCIBERSORT CD8 proportion change (resection - biopsy) andTMA CD8 density change (r = 0.31), respectively.

## Table 1:

The number of patients with immune response and clinical response status available in Regimen 1 and Regimen 2 respectively.

		Regimen 1	Regimen 2
Immune response (n=33)	Responder	15	4
	Non-responder	5	9
Clinical response (n=77)	PR	6	2
	SD	33	17
	PD	10	9

## Table 2:

The number of potential differentially methylated regions (DMRs) derived from EPIC BeadChip data that are hyper- or hypo-methylated in Regimen 1 and Regimen 2, separately.

Direction in resection	Regimen 1	Regimen 2
Hypermethylated	523	721
Hypomethylated	1	112
Total	524	833