



## Cytotoxicity of nicotinamide (NAM)-enhanced natural killer (NK) cells (GDA-201) is based on metabolic modulation as demonstrated by artificial intelligence – assisted analysis of NK cell transcriptome and metabolome

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#### BACKGROUND

- Nicotinamide (NAM), an allosteric inhibitor of nicotinamide adenine dinucleotide (NAD)-dependent enzymes, has been shown to preserve cell function and prevent differentiation in ex vivo cell culture
- GDA-201 is an investigational natural killer (NK) cell immunotherapy derived from allogeneic donors and expanded using interleukin-15 and NAM. In previous preclinical studies, NAM led to increased homing and cytotoxicity, preserved proliferation, and enhanced tumor reduction of NK cells
- In a phase 1 clinical trial, treatment with GDA-201 showed tolerability and clinical responses in patients with refractory non-Hodgkin lymphoma<sup>1</sup>
- While NAM is known to affect cellular metabolism and participate in hundreds of enzymatic reactions as an inhibitor or activator, its mechanism of action and role in GDA-201 cytotoxicity are unknown

#### NICOTINAMIDE



NAD: nicotinamide adenine dinucleotide; NAM: nicotinamide; ROS: reactive oxygen species.

lays a key role in metabol reprogramming of cells

- a master regulator of **NAD**-related signaling pathways
- Enhances cellular functionality and phenotype
- Improves **homing** and **retention** to lymphoid tissues

#### OBJECTIVE

 Identify mechanistic network of interaction between differentially expressed genes and intracellular metabolites associated with enhanced biological functional activity of GDA-201 NK cells

#### STUDY DESIGN AND METHODS



NAM: nicotinamide; NK: natural killer; RNA: ribonucleic acid.

- Apheresis-derived ex vivo-expanded NK cell phenotype, in vitro and in vivo performance were characterized, and transcriptome and metabolome samples were collected
- Next-generation sequencing was performed on Illumina HiSeq 2500 (Cel-SEQ, NGS). Raw sequences were trimmed and filtered using Trim Galore! and carried out using the NeatSeq-Flow platform. Reads were aligned to the human genome using STAR (Ensembl GRCh38.p10). Quality assurance of the process was carried out using FASTQC, MultiQC, and Qualimap. Statistical analysis was carried out using DESeq2 and R SVA/Combat, and Scater packages. Donor-derived batch effect was statistically corrected
- Thermo Q-Exactive Plus mass spectrometer coupled with a Vanquish UHPLC system, using Xbridge BEH Amide column (150 × 2 mm, 2.5 µm particle size; Waters, Milford, MA, USA) was used to quantify the extracted metabolites. All samples were analyzed with a MS1 scan range of m/z 70–1000 with a resolving power of 160,000 at m/z 200. Data analysis was performed using El-Maven and the metabolites identified with an in-house library using authentic standards. Donor-derived batch effect was statistically corrected
- The data from public bioinformatic databases and natural language processed NK cell-related articles were used to create the map of interactions and in silico model for further analysis (Pomicell company)
- Pomicell proprietary machine learning algorithm was used to create a mechanistic network between the differentially expressed gene and significantly changed metabolites
- F1-score cross-validation test was used to filter the most biologically relevant interaction map that could explain the measured in vitro and in vivo results

Nicotinamide
Nicotinate
1-Methylnicotinami
NAD+
Cyclic-ADP-ribose Nicotinamide ribosi
NADPH NADH
GTP ATP
NADP+ CDP
N-acetyl-glutamine Glutamine
Pyroglutamine
GIn-Glu Inositol 1. N-Acetylserine
dAMP

FDR: false detection rate; NAM: nicotinamide.

Scientific articles (PubMed)

Public bioinformatio databases



## A549 cell line assay -NAM -NAM +NAM +NAM 40 TNFα BL-2 tumor burden in NSG mice spleen SELL (CD62L) expression p=3.8×10<sup>-5</sup> (t test, 2-tailed, unequal variance) NAM Control NAM (mM) Experimental In vitro / transcriptome in vivo results 226 27 increased intracellular metabolites intracellular metabolites Experimental data (*t* test, 2-tailed, unequal variance) INPUT Machine learning POMICELL Pomicell **Artificial Intelligence** Predicted OUTPUT algorithm **Cross-validation (f1 = 83%)**

#### ARTIFICIAL INTELLIGENCE-PREDICTED MECHANISTIC NETWORK OF INTERACTIONS



#### SUMMARY

- activation
- acid level PPARa inhibition

### CONCLUSIONS

potential

#### REFERENCE

1. Bachanova V, et al. *Blood*. 2019;134(Suppl 1):777.

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# Upregulation of the NK cell activation Downregulation of the NK cell inhibition Juanosine 🛉 Increase of NK cell trafficking to the lymph nodes

• NAM-mediated reduction of intracellular AMP and inosinic acid levels reduced NK inhibiting ADRB2 signaling • Upregulated ATP and GTP cytosolic concentrations increase GDA-201 NK cell activation via HMGB1 and HMOX1

• Significant upregulation of CD62L (SELL) membrane expression on GDA-201 NK cells was predicted by multiple different pathways, including TFDP1/DHFR activation, histamine/HMGB1 upregulation, PARP1/F0X01 activation, and reduced folic

• Superior ADCC and cytotoxic GDA-201 activity were followed by an increased expression of a degranulation marker CD107a, and enhanced production of IFNy and TNF $\alpha$ , that were predicted to be mediated by increased expression of JUN, reduction of intracellular folic acid level, and RELA/PTPN1-mediated upregulation of HMOX1

• Artificial intelligence-mediated analysis shows GDA-201 NK cells have increased cytotoxicity, ADCC, homing, and in vivo antitumor



