

# A terminal metabolite of niacin promotes vascular inflammation and contributes to cardiovascular disease risk

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## Abstract

Despite intensive preventive cardiovascular disease (CVD) efforts, substantial residual CVD risk remains even for individuals receiving all guideline-recommended interventions. Niacin is an essential micronutrient fortified in food staples, but its role in CVD is not well understood. In this study, untargeted metabolomics analysis of fasting plasma from stable cardiac patients in a prospective discovery cohort ( $n = 1,162$  total,  $n = 422$  females) suggested that niacin metabolism was associated with incident major adverse cardiovascular events (MACE). Serum levels of the terminal metabolites of excess niacin, N1-methyl-2-pyridone-5-carboxamide (2PY) and N1-methyl-4-pyridone-3-carboxamide (4PY), were associated with increased 3-year MACE risk in two validation cohorts (US  $n = 2,331$  total,  $n = 774$  females; European  $n = 832$  total,  $n = 249$  females) (adjusted hazard ratio (HR) (95% confidence interval) for 2PY: 1.64 (1.10-2.42) and 2.02 (1.29-3.18), respectively; for 4PY: 1.89 (1.26-2.84) and 1.99 (1.26-3.14), respectively). Phenome-wide association analysis of the genetic variant rs10496731, which was significantly associated with both 2PY and 4PY levels, revealed an association of this variant with levels of soluble vascular adhesion molecule 1 (sVCAM-1). Further meta-analysis confirmed association of rs10496731 with sVCAM-1 ( $n = 106,000$  total,  $n = 53,075$  females,  $P = 3.6 \times 10^{-18}$ ). Moreover, sVCAM-1 levels were significantly correlated with both 2PY and 4PY in a validation cohort ( $n = 974$  total,  $n = 333$  females) (2PY:  $\rho = 0.13$ ,  $P = 7.7 \times 10^{-5}$ ; 4PY:  $\rho = 0.18$ ,  $P = 1.1 \times 10^{-8}$ ). Lastly, treatment with physiological levels of 4PY, but not its structural isomer 2PY, induced expression of VCAM-1 and leukocyte adherence to vascular endothelium in mice. Collectively, these results indicate that the terminal breakdown products of excess niacin, 2PY and 4PY, are both associated with residual CVD risk. They also suggest an inflammation-dependent mechanism underlying the clinical association between 4PY and MACE.

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