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# Genetic Variations in Multiple Drug Action Pathways and Survival in Advanced-Stage Non-small Cell Lung Cancer Treated with Chemotherapy

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# Abstract

**Purpose**—Variations in genes related to anticancer drugs' biologic activity could influence treatment responses and lung cancer prognosis. Genetic variants in four biological pathways, i.e., glutathione metabolism, DNA repair, cell cycle, and EGFR, were systematically investigated to examine their association with survival in advanced-stage NSCLC treated with chemotherapy.

**Experimental Design**—A total of 894 tagging single-nucleotide polymorphisms (tagSNPs) in 70 genes from the four pathways were genotyped and analyzed in a 1076-patient cohort. Association with overall survival was analyzed at single-SNP and whole-gene levels within all patients and major chemotherapy agent combination groups.

**Results**—A poorer overall survival was observed in patients with genetic variations in *GSS* (glutathione pathway) and *MAP3K1* (EGFR pathway) (HR=1.45, 95% CI=1.20–1.70 and HR=1.25, 95% CI=1.05–1.50, respectively). In stratified analysis on patients receiving platinum

Conflicts of interest None.

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**Contributions** Ping Yang led the study by designing and conducting it, interpreting results, writing the manuscript, and obtaining funding. Yafei Li coordinated the data analysis, results interpretation, and writing of the manuscript. Zhifu Sun searched the literature for the genes in the pathways, conducted tagSNP selection/custom panel design, and contributed to the final manuscript writing. V. Shane Pankratz led the statistical analyses and contributed to the final manuscript writing. Jason A. Wampfler and Jeremiah A. Aakre participated in the data analysis. Marie C. Aubry undertook pathology verification. Julie M. Cunningham led the genotyping of the Mayo Clinic samples. Julian Molina and Gary A. Croghan coordinated participant eligibility determination and enrollment. Danli Wu and Cassandra Johnson abstracted medical records data. Liewei Wang contributed to data collection and manuscript writing. All authors contributed to the final paper.

plus taxane treatment, we observed a hazardous effect on overall survival by *MAP3K1* variant (HR=1.38, 95% CI = 1.11-1.72) and a protective effect by *RAF1* (HR=0.64, 95% CI=0.5-0.82) in the EGFR pathway. In patients receiving platinum plus gencitabine treatment, *RAF* and *GPX5* (glutathione pathway) genetic variations showed protective effects on survival (HR=0.54, 95% CI=0.38-0.77; HR=0.67, 95% CI=0.52-0.85, respectively); in contrast, *NRAS* (EGFR pathway) and *GPX7* (glutathione pathway) variations showed hazardous effects on overall survival (HR=1.91, 95% CI=1.30-2.80; HR=1.83, 95% CI=1.27-2.63, respectively). All genes that harbored these significant SNPs remained significant by whole-gene analysis.

**Conclusion**—Common genetic variations in genes of *EGFR* and glutathione pathways may be associated with overall survival among patients with advanced-stage NSCLC treated with platinum, taxane, and/or gemicitabine combinations.

#### Keywords

non-small cell lung cancer; survival; single-nucleotide polymorphisms; pathway; chemotherapy

#### Introduction

Non-small cell lung cancer (NSCLC) represents more than 80% of lung cancer diagnoses.(1) For advanced-stage (stage III and stage IV) NSCLC, 5-year survival varies widely (3–50%) depending on the number of lymph nodes involved, resectability, and tumor histology.(2) Established prognostic factors include stage, gender, age, and performance status.(3) Chemotherapy remains the major component of the standard care in conjunction with radiation therapy and supportive care for patients with advanced-stage lung cancer. For a given treatment, usually prescribed by a standard dosing protocol, survival time widely varies even after stratification by tumor stage, histology, and other clinical information, highlighting the need for improved predictive markers. In addition to clinical and biological behaviors of the tumor, multiple drug metabolism systems of the host also have an impact on the outcomes for lung cancer patients. Pharmacogenomic studies have defined gene variations responsible for varied drug efficacy. Patient-specific genetic profiles of genetic variants related to drugs' biological activity may help improve drug selection.

The glutathione metabolic pathway (GSH pathway) is directly involved in the detoxification or inactivation of multiple anticancer drugs, with evolving clinical relevance in lung cancer treatment.(4) The efficacy of anticancer drugs is highly influenced by cellular DNA repair capacity; increasing evidence shows reduced DNA repair capacity resulting from genetic polymorphisms of various DNA repair genes being associated with improved survival after platinum-based chemotherapy.(5-10) Taxanes (paclitaxel and docetaxel) are a class of anticancer agents, which exert their cytotoxic effects on spindle microtubules dynamics causing cell cycle arrest and apoptosis.(11, 12) These agents have been widely used as active chemotherapeutic agents in the treatment of NSCLC. Genes that regulate the cell cycle are thought to be involved in the biological activities of taxanes, although the impact of genetic variants in cell cycle pathway genes on clinic outcomes is unclear. The epidermal growth factor receptor (EGFR) is a tyrosine kinase transmembrane receptor in the ErB family of receptors expressed on the surface of epithelial cells, including NSCLC, regulating important processes in cell survival, cell cycle progression, tumor invasion, and angiogenesis.(13, 14) The EGFR pathway has been recognized as an important drug target. The EGFR tyrosine kinase inhibitors (TKIs), namely Gefitinib (IRESSA) and Erlotinib (Tarceva) are extensively studied in NSCLC and are currently incorporated into clinical practice. The EGFR pathway is associated with platinum-chemotherapy sensitivity in cancer patients in a recent study.(15)

A variety of chemotherapeutic drugs are used, and most advanced-stage NSCLC patients receive more than one drug; therefore, genetic variants of genes in multiple major drug action pathways may have combined effects on outcomes. However, most studies thus far have focused on limited candidate SNPs from a few selected genes. The influence of genetic variation in multiple pathways on NSCLC prognosis remains poorly understood. In this study, genetic variants of 70 key genes in four candidate pathways related to major chemotherapy drug actions, i.e., GSH, DNA repair, cell cycle, and EGFR pathways (Supplementary Figure 1), were systematically investigated in a prospectively followed cohort of advanced-stage NSCLC patients. Our goal was to examine whether SNP markers from the selected pathways are collectively associated with lung cancer overall survival among NSCLC patients receiving chemotherapy.

# **Materials and Methods**

# Patient Cohort

Lung cancer patients were identified and enrolled between 1997 and 2008. Detailed procedures of patient enrollment, diagnosis, data collection, and follow-up have been previously described. (16–18) Briefly, new cases diagnosed with lung cancer were identified by a daily electronic pathology reporting system. Once identified, patients were invited to participate and enrolled after their consent. The overall participation and blood sample donation rates were 87%. Demographic and tobacco history data were obtained from medical records and interview. When the patient received any therapy elsewhere, authorization for the release of medical information was requested, and copies of the relevant medical records were abstracted. Treatment information was obtained from oncology records, treatment data, outside medical records, and follow up questionnaires. Surgery was defined as a treatment when the patient had any pulmonary resection for the primary tumor, including pneumonectomy, bilobectomy, lobectomy, segmentectomy, and wedge resection. Chemotherapy agents, dosage, and date treatment started and ended were abstracted. Radiation was categorized as radiation to the chest only, radiation to another place with specific location the radiation occurred, gamma knife, and PCI; elapsed days for radiation, energy, radiation dose, times per day, and fractions were also abstracted. Clinical staging and recurrence or progression was determined by results from available chest radiography, computerized tomography, bone scans, position emission tomography scans, and magnetic resonance imaging. All patients were actively followed beginning within 6 months of diagnosis, with subsequent annual follow-up by mailed questionnaires. Annual verification of patients' vital status was accomplished through the use of Mayo Clinic's electronic medical notes and registration database, next-of-kin reports, death certificates, and obituary documents filed in the patients' medical records, as well as through the Mayo Clinic Tumor Registry and Social Security Death Index website. Well-trained abstractors conducted information abstraction and data entry. Research protocols were approved by the Mayo Clinic's Institutional Review Board.

## Pathway, gene and SNP selection

We focused on four common candidate pathways related to major chemotherapy drug actions, i.e., GSH, DNA repair for platinum based agents, cell cycle for taxanes, and EGFR pathways following a review of the literature in lung cancer therapy. Note that each of the four pathways may relate to multiple drug actions, particularly for individual genes; specifically, a gene can participate in multiple drug action pathways other than the one that was selected. Seventy genes were selected from four pathways following a review of the literature (Supplementary Table 1). TagSNPs (19, 20) were identified via SNPApp, a tagSNP selection program developed by the Bioinformatics Core at Mayo Clinic, Rochester, MN. SNPApp queries multiple public SNP data repositories (Hapmap, SeattleSNPs, and

linkage disequilibrium threshold of  $r^2 \ge 0.8$ . For a given gene, the SNP selection procedure used the SNP data repository with the greatest number of SNPs with a MAF  $\ge 0.05$  and the greatest number of linkage disequilibrium bins that met Illumina Golden Gate Assay quality score thresholds. Nonsynomyous SNPs were preferentially selected as tags when they were identified, provided that their metrics were equivalent to those of alternative tagSNPs.

## **Genotyping and Quality control**

A total of 1025 tagSNPs were genotyped in the Mayo Clinic Genomics Shared Resource using a custom-designed Illumina GoldenGate panel. Concordance among the three genomic control DNA samples present in duplicate was 100%. Subjects with a call rate was over 90% for all subjects; 111 SNPs failed genotyping. Of the SNPs with genotyping data, the call rate was >95%, and the minor allele frequency was >0.001 for all. SNPs with a Hardy-Weinberg equilibrium test p-value< $1 \times 10^{-7}$  (n=11) and/or monomorphic (n=9) were excluded, resulting in 894 SNPs in the analyses.

#### Chemotherapy agent information

Chemotherapy regimens mostly fall into four groups (Supplementary Table 2): (1) platinum agents (P) including carboplatin and cisplatin, (2) taxane agents (T), paclitaxel and docetaxel, (3) gemcitabine (G), and (4) EGFR inhibitors (E), Gefitinib (IRESSA) and Erlotinib (Tarceva). Only a very small group of patients received drugs outside of these four groups; therefore, patients were divided into two subgroups based on the most commonly used combinations: platinum plus taxanes with or without other agents (PT group), platinum plus gemcitabine with or without other agents (PG group). We performed subsequent analyses on the significant SNPs in more restricted drug combinations: (1) platinum plus taxanes alone (PT-only group); (2) platinum plus any other agents except gemcitabine (P/no-G group); (4) platinum plus taxanes without EGFR inhibitors (PT/no-E); (5) platinum plus gemcitabine without EGFR inhibitors (PT/no-E); (5) platinum plus any other agents (E group).

## Outcomes

Overall survival time was used as the primary endpoint, defined as the time from lung cancer diagnosis to either death or the last known date alive. Patients known to be alive were censored at the time of last contact.

#### Statistical analysis

**Single-SNP association analysis**—A backward selection process was used to screen potential confounders: age at diagnosis, sex, race, smoking status, stage, histological types, comorbidity, and treatment modality. The significant variables were retained as covariates in all subsequent analyses. A Cox regression model was used to assess the associations between each SNP's genotypes and overall survival. The primary test of association was based on a genetic model free scheme (2 degrees of freedom). In subgroups, for SNPs where five or fewer minor allele homozygotes were observed, homozygote genotypes were combined with heterozygotes. If combined frequency was still five or fewer, then the SNP was removed. Hazard ratios (HRs) and 95% confidence intervals (CI) were estimated, comparing patients carrying one and two minor alleles individually to patients carrying two major alleles. To account for multiple comparisons in the SNP-based analysis, q-values set

at 0.20 were computed using the single-SNP p-values to quantify the probability that a p-value might be a false positive,(22) accepting a false discovery rate of 20%. The significant SNPs were further tested in refined treatment groups using the same methods outlined above. Kaplan-Meier curves and log-rank tests were used to assess the differences in survival time by individual SNPs.

**Principal Components Analysis (PCA) by whole-gene**—In order to assess whether different analytical approaches resulted in consistent findings, we performed whole-gene tests of association using a PCA approach. We utilized a genetic model free scheme that used two indicator variables for each SNP, one for the heterozygous and one for the homozygous minor allele carriers and extracted sufficient principal components to capture 90% of the SNP. The resulting collection of principal component variables was used for an omnibus test of significance for the association between each gene and survival in the multivariable Cox proportional hazards regression models. P-values for the global tests were obtained, along with summaries of the PCA.

All reported p-values were based on a two-sided test. All statistical analyses were performed using SAS, version 9 (SAS Institute, Inc.) or R-project software.

# Results

Table 1 provides descriptive characteristics of 1076 advanced-stage NSCLC patients. The median overall survival time was 1.7 years with 83.8% deceased within the 11-year followup period. Of the 1076 patients, 962 (89.4%) had chemotherapy, of which 657 (68.3%) were treated with PT, and 305 (31.7%) with PG (Supplementary Table 2). Eighty-eight percent of the patients had documented lung cancer progression or recurrence. In the PT group, gender and treatment modality were significant confounders; and in the PG group, gender, histological types, and treatment modality were significant confounders (Supplementary Table 3).

The analytic strategy is presented in Figure 1. Significant SNP associations in each treatment group are summarized in Table 2. A poorer overall survival was observed in all patients with minor alleles of rs17309872 in *GSS* from the GSH pathway and rs17661089 in *MAP3K1* from the EGFR pathway [HR=1.45, 95% CI=1.20–1.7 and HR=1.25, 95% CI=1.05–1.50, respectively] (Table 2 and Supplementary Figure 1). By gene-level tests, *GSS* and *MAP3K1* remained significant ( $p=3.76 \times 10^{-2}$  and  $1.80 \times 10^{-2}$ , respectively).

In stratified analysis of the PT group, 4 SNPs, rs17661089, rs16886403, rs726501 (in the *MAP3K1* gene of the *EGFR* pathway), and rs11710163 (in *RAF1* of *EGFR* pathway) were significantly associated with overall survival. Patients with rare homozygote genotypes of these variants in *MAP3K1* had significantly poorer overall survival, while patients with heterozygotes at rs11710163 (in *RAF1*) had better overall survival compared to having common homozygotes (Table 2 and Supplementary Figure 3). By gene-level tests, *MAP3K1* and *RAF1* were the top two significant genes ( $p=6.10\times10^{-3}$  and  $3.14\times10^{-2}$ , respectively) in the PT group, consistent with the single-SNP level analysis (Table 3). We further analyzed the four significant SNPs in the PT-only, P/no-T, P/no-E, and E groups, accordingly. All of the four SNPs were replicated in the P/no-E group; three SNPs in *MAP3K1* were replicated in the PT-only group; none showed significance in the P/no-T or E groups (Supplementary Table 4).

In the PG group, rs11710163 in *RAF1* was also found to be significant; patients with a heterozygote genotype showed a nearly doubled overall survival compared to patients with a common homozygote genotype (HR=0.54, 95% CI=0.38–0.77). The heterozygote genotype

at rs451774 in the *GPX5* gene also had a protective effect on overall survival, with the HR=0.61 (95% CI=0.47–0.79). In contrast, heterozygote genotypes at rs1065634 in *NRAS* and rs12118636 in *GPX7* showed a nearly doubled risk for death (HR=1.91; 95% CI=1.30–2.80 and HR=1.83; 95% CI=1.27–2.63, respectively) (Table 2 and Supplementary Figure 4). The genes, *RAF1*, *GPX5*, *GPX7*, and *NRAS*, which harbored the significant SNPs, were also confirmed to be significant (Table 3). We analyzed the four significant SNPs in the P/no-G, PG/no-E, and E groups, and all four SNPs were replicated in the PG/no-E group; however, none remained significant in the P/no-G or E groups (Supplementary Table 4).

# Discussion

In this study, we systematically investigated the associations between 894 SNPs in 70 key genes from four drug action pathways and overall survival in patient groups receiving different chemotherapy agent combinations. Genetic variations in *MAP3K1* in the EGFR pathway and *GSS* in the GSH pathway were associated with overall survival in the analysis of all patients. In the stratified analysis on patients receiving platinum plus taxane treatment, *MAP3K1* and *RAF1* variations in the EGFR pathway were associated with survival. In patients receiving platinum plus gemcitabine treatment, *RAF* and *GPX5* (GSH pathway), *NRAS* (EGFR pathway), and *GPX7* (GSH pathway) showed predictive effects on overall survival.

The glutathione synthetase gene (*GSS*) encodes the enzyme glutathione synthetase. Mutations in *GSS* prevent cells from making adequate levels of glutathione, leading to glutathione synthetase deficiency (23). Genetic variations in *GSS* were also found to be associated with overall survival of small cell lung cancer after treatment (24). It is interesting to observe *GSS* variants, instead of other commonly reported genetic variations, such as *GSTM1*, *GSTP1*, and *GSTT1*, as the most significant predictive markers in our systematic GSH pathway SNP analysis. It is proactive to observe that genetic variations in *MAP3K1* from the EGFR pathway are also significant predictive markers for survival in patients receiving the most commonly used doublet agents, cisplatin or carboplatin and paclitaxel or docetaxel, even after restricting down to patients who did not receive EGFR inhibitor agents.

The single-SNP and whole-gene analyses consistently indicated that genetic variations in *MAP3K1* and *RAF1* were significantly associated with overall survival in the PT group. Three SNPs, rs17661089, rs16886403, and rs726501 in *MAP3K1*, were significant. The associations of these SNPs in *MAP3K1* were further replicated in the PT-only group, suggesting that polymorphic variants in the *MAP3K1* were specifically associated with overall survival in patients receiving platinum and taxanes. All four SNPs were replicated in the P/non-E group, but not in the E group, suggesting the associations of these SNPs with overall survival may be independent of the effect of the EGFR inhibitors, although both *MAP3K1* and *RAF1* regulate the EGFR pathway.

*MAP3K1* has a pivotal role in a network of phosphorylating enzymes integrating cellular responses to a number of mitogenic and metabolic stimuli. *MAP3K1* phosphorylates and activates MAPK kinase (MAPK2), which in turn phosphorylates MAPK/ERK to produce downstream signaling effects on a variety of cancer genes (Supplementary Figure 1).(25, 26) Researchers have recently reported an association between the EGFR pathway and platinum-chemotherapy sensitivity in colorectal cancer.(15) Other genes in the EGFR pathway, such as *EGFR* itself, also have been demonstrated to be associated with lung cancer outcomes.(13, 14) For the three significant SNPs in *MAP3K1*, rs17661089 and rs16886403 are in relatively high linkage disequilibrium with rs726501 ( $r^2$ =0.64 and 0.72, respectively). rs17661089 is located in the flanking region of 5'-UTR, and the other two

SNPs are located in intron 1 of the gene. rs17661089 was predicted to be in the transcription factor binding sites (TFBS); this SNP may be a functional SNP or other variants in high linkage disequilibrium with it possibly influence the expression level of the gene product, requiring further functional analyses.

The RAF family is composed of three related serine/threonine protein kinases - RAF1, A-RAF and B-RAF— which act, in part, as downstream effectors of the RAS pathway.(27) Activated RAS interacts directly with the amino-terminal regulatory domain of the RAF kinase, which results in a cascade of reactions including direct activation of MEK.(28–30) Constitutively active mutated RAF can transform cells *in vitro*.(31) RAF may play a broader role in tumorigenesis and promotes the expression of the multi-drug resistance gene MDR1. (30) RAF1 holds an important role in cell growth, proliferation, and cell survival.(32, 33) The RAF1 protein has been found to be amplified in different lung cancer cell lines. One study showed that the RAF expression level is critical in tumor development.(34) Ravi *et al* reported that activated RAF1 causes growth arrest in human small cell lung cancer cells. (35) Immunohistochemical staining indicated that RAF1 was present in 49/53 ovarian adenocarcinomas and high c-RAF expression correlated significantly with poor survival in ovarian cancer.(36) The SNP, rs11706408, that has high linkage disequilibrium (r2=1) with rs11710163 in RAF1 was predicted to be in the TFBS; their functional roles in NSCLC chemotherapy agent actions and patient survival need to be further investigated.

Four SNPs in *RAF1*, *GPX5*, *GPX7*, and *NRAS* were found to be significantly associated overall survival in the PG group. All four SNPs were replicated in the PG/non-E group but were not replicated in the E group, indicating the association of being independent of the effect of the EGFR inhibitors. None of the four SNPs remained significant in the P/non-G group, suggesting the association of the variations in *RAF1*, *GPX5*, *GPX7*, and *NRAS* with overall survival in the PG group may reflect the effect of gemcitabine.

The GSH pathway has been related with detoxification or inactivation of platinum drugs. Glutathione peroxidases (GPXs) are a major antioxidative damage enzyme family that catalyzes the reduction of hydrogen peroxide, organic hydroperoxide, and lipid peroxides by reduced glutathione.(37-39) GPX has at least seven allozymes, distributed in different organs. In this study, GPX5 rs451774 and GPX7 rs12118636 were found to be associated overall survival in the PG group. The association of GPX5 and GPX7 were also confirmed by whole gene-based analysis. Function prediction indicated that rs451774 located at 3' UTR of *GPX5* was in both TFBS and miRNA binding sites, and is a potential functional SNP. GPX5 has structural similarity to GPX1.(40) A recent study reported GPX1 may be an inherited factor in predicting patients' quality of life.(41) In previous studies, variation in GPX1 was linked tumor recurrence of bladder cancer.(42) GPX7 shares a similar structural domain to GPX4. Reported findings suggest a potential role for GPX7 in alleviating oxidative stress induced by dietary consumption of fatty acids in breast cancer cells.(43) Common variations in GPX4 were associated with prognosis after a diagnosis of breast cancer.(44) However, no reports are currently available on the association of GPX5 and GPX7 variations and clinical outcomes. Our findings showed that genetic variations in GPX5 tend to predict a better survival, while variations in GPX7 were associated with worse survival. Current evidence also indicates the diversified roles of the individual GPX;(45) individual GPX might have different impact on the clinical outcome of lung cancer.

The SNP, rs1065634, is located at 5' near the gene region of *NRAS*. This SNP also was found to be significant in the PG group. *NRAS* is a member of the *RAS* proto-oncogene family. Point mutations of the *RAS* proto-oncogene family members are among the most frequent genetic alterations found in human cancer.(46, 47) Until now, *NRAS* gene mutations were mainly associated with hematopoietic malignancies(48), melanomas(49),

To our knowledge, our study presents the first and largest effort to comprehensively characterize the associations of gene alterations in four chemotherapy drug action pathways and survival in advanced-stage lung cancer patients. Platinum drugs, combined with other cytotoxic agents, continue to be the first-line chemotherapy for advanced-stage lung cancers and other metastatic cancers. Our study is strengthened by using different agent combinatorial groups for stratified analysis, which more closely mimics clinic practice than studies using single drug-based groups. We also used different analytic strategies and subgroups to confirm our results.

There are several limitations. First, despite efforts to account for potential confounding factors and careful adjustment for multiple tests in the analyses, false-positive associations cannot be completely ruled out. Second, although the significant SNPs were carefully analyzed in different combinatorial agent subgroups, chemotherapy heterogeneity may also modify the true association between genetic variation and clinical outcomes. Third, although our patient cohort represents one of the largest among all published combinatorial agent pharmacogenetics studies for late stage NSCLC, the power of this study to detect association was still modest, and it is possible that we missed some real associations with a small effect. For example, in the PG group, using a type I error level of  $6 \times 10^{-5}$  (0.05/984), we had 86% power to detect effects from SNPs with a minor allele frequency of 0.3, which confers a perallele HR of 1.6. If the per-allele HR is instead 1.4, the power is only 35%. Fourth, a thorough evaluation of the gemcitabine pathway SNPs was not included in this study. An additional limitation was the lack of patients treated with first-line EGFR inhibitor drugs, so the specific SNP effects could not be detected or evaluated relevant to these drugs. Our study focused on late-stage NSCLC patients who were treated with platinum drugs with or without other treatments, which will limit the ability to compare our results to other data sets. Nonetheless, our study is useful for testing a novel hypothesis, which may be confirmed in future specifically-designed clinical studies.

In summary, our results suggest that variations of *MAP3k1* and *RAF1* may be associated with overall survival among patients treated with platinum and taxane agents. Polymorphisms in the *RAF1*, *NRAS*, *GPX5*, and *GPX7* genes were found to be associated with overall survival among patients treated with platinum and gemcitabine agents. In the current clinical practice, oncologists usually select patients who they expect to benefit from chemotherapy based on available clinical information. Validated biomarkers, even with small effects, may have utility in optimizing patient therapies. Therefore, our findings could be considered in prospective biomarker-stratified clinical trials.

#### Statement of Translation Relevance

The prognosis for patients with advanced-stage non-small cell lung cancer (NSCLC) remains very poor. Chemotherapy remains the major component of the standard care for patients with advanced-stage lung cancer. This study comprehensively characterized the associations of gene alterations in four chemotherapy drug action pathways i.e., glutathione, DNA repair, cell cycle, and EGFR, and survival in advanced-stage NSCLC patients. Our results suggest that variations of *MAP3K1* and *RAF1* may be associated with overall survival among patients treated with platinum and taxane agents. Polymorphisms in the *RAF1*, *NRAS*, *GPX5*, and *GPX7* genes were found to be associated with overall survival among patients treated with platinum and gemcitabine agents. These

genetic variations may be applied to future prospective biomarker-stratified clinical trials, and help in designing patient-specific treatment and in predicting patients' survival.

# **Supplementary Material**

Refer to Web version on PubMed Central for supplementary material.

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## Figure 1. Study design and key findings

PT group, platinum plus taxanes with or without other drugs; PG group, platinum plus gemcitabine with or without other agents; PT-only group, platinum plus taxanes alone; P/no-T group, platinum plus any other agents except taxanes; PT/no-E group, both platinum and taxanes without EGFR inhibitors; E group, EGFR inhibitors alone or plus any other agents; P/no-G group, platinum plus any other agents except gemcitabine; PG/ no-E group, both platinum and gemcitabine without EGFR inhibitors.

# Table 1

# Characteristics of the patients

		Pa	tients by treatment group	ps
Patient characteristics	All patients n=1076 (%)	PT group <sup><i>a</i></sup> n=657 (%)	PG group <sup>b</sup> n=305 (%)	Other patients <sup>C</sup> n=133 (%)
Alive/death	174/902 (16.2/83.8)	108/549 (16.4/83.6)	27/278 (8.9/91.2)	23/110 (17.3/82.7)
Survival time (years)				
Median (range)	1.7 (0.1–11.0)	1.8 (0.1–10.7)	1.9 (0.2–10.1)	1.4 (0.2–8.2)
Mean(SD)	2.4(2.1)	2.6(2.2)	2.3(1.7)	2.1(1.6)
Age at diagnosis (years)				
Mean(SD)	62.4(11.0)	61.0(10.5)	61.0(10.9)	64.9(11.4)
≤ 50	176(16.4)	125(19.0)	59(19.3)	16(12.0)
50-70	592(55.0)	383(58.3)	169(55.4)	67(50.4)
≥70	308(28.6)	149(22.7)	77(25.3)	50(37.6)
Men/women (%)	597/479 (55.5/44.5)	360/297 (54.8/45.2)	159/146 (52.1/47.9)	74/59 (55.6/44.4)
Race				
Non-Caucasian	57(5.3)	37(5.6)	14(4.6)	6(4.5)
Caucasian	1019(94.7)	620(94.4)	291(95.4)	127(95.5)
Smoking history at diagnosis (%)				
Never	197(18.3)	133(20.2)	79(25.9)	24(18.1)
Former	542(50.4)	314(47.8)	142(46.6)	69(51.9)
Current	337(31.3)	210(32.0)	84(27.5)	40(30.1)
Histological type				
Adenocarcinoma/BAC <sup>d</sup>	637(59.2)	387(58.9)	193(63.3)	81(60.9)
Squamous	197(18.3)	118(18.0)	43(14.1)	22(16.5)
Other and unclassified $\text{NSCLC}^{e}$	242(22.5)	152(23.1)	69(22.6)	30(22.6)
Stage				
IIIA	304(28.3)	182(27.7)	60(19.7)	29(21.8)
IIIB	263(24.4)	160(24.4)	81(26.6)	29(21.8)
IV	509(47.3)	315(48.0)	164(53.8)	75(56.4)
Comorbidity diseases				
Pulmonary diseases (%)				
Yes	542(50.4)	322(49.0)	123(40.3)	67(50.4)
No	534(49.6)	335(51.0)	182(59.7)	66(49.6)
Non-pulmonary diseases (%)				
Yes	692(64.3)	434(66.1)	187(61.3)	72(54.1)
No	384(35.7)	223(33.9)	118(38.7)	61(45.9)
Other cancers $f(\%)$				
Yes	292(27.1)	172(26.2)	72(23.6)	35(26.3)
No	784(72.9)	485(73.8)	233(76.4)	98(73.7)
Lung cancer recurrence/				

progression/new primary

		Pa	atients by treatment group	os
Patient characteristics	All patients n=1076 (%)	PT group <sup><i>a</i></sup> n=657 (%)	PG group <sup>b</sup> n=305 (%)	Other patients <sup>c</sup> n=133 (%)
Yes (%)	947(88.0)	581(88.4)	290(95.1)	113(85.0)
No (%)	129(12.0)	76(11.6)	15(4.9)	20(15.0)
Treatment modality				
Only chemotherapy (%)	319(29.7)	209(31.8)	116(38.0)	52(39.1)
Only radiation (%)	36(3.4)	0(0)	0(0)	0(0)
Both chemotherapy and radiation (%)	358(33.3)	250(38.1)	118(38.7)	49(36.8)
Both chemotherapy and surgery (%)	86(8.0)	62(9.4)	21(6.9)	11(8.3)
Both radiation and surgery (%)	42(3.9)	0(0)	0(0)	0(0)
Chemotherapy, radiation, and surgery (%)	199(18.5)	136(20.7)	50(16.4)	21(15.8)
Other treatment <sup>g</sup>	36(3.4)	0(0)	0(0)	0(0)

 $^{a}$ Platinum plus taxanes with or without other drugs.

 $^{b}$ Platinum plus gemcitabine with or without other agents, not mutually exclusive from the PT group.

<sup>c</sup>Patients not receiving platinum, taxanes, and gemcitabine.

 $^{d}$ Bronchioalveolar carcinoma.

<sup>e</sup>Non-small cell lung cancer.

 $f_{\rm Excludes \ non-melanoma \ skin \ cancer.}$ 

<sup>g</sup>Includes all other treatment except for chemotherapy, radiation, and surgery to lung.

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# Table 2

Chemotherapy agent-relevant pathway gene polymorphisms and overall survival

Pathway	Gene	SNP	Genotype	Alive/Death	MAF <sup>a</sup>	Median survival (years)	HR $(95\% \text{ CI})^b$	p-value <sup>b</sup>	q-value
All patien	its (n=1076)								
GSH	GSS	rs17309872		174/902	0.06				
			TT	161/783		1.80	Ref		
			TA	13/117		1.46	1.44(1, 19-1.76)	2.39E-04	
			TA+AA				1.45(1.20–1.77)	1.47E-04	
			Model free test $d$					3.28E-04	1.50E-01
EGFR	MAP3K1	rs17661089		174/902	0.08				
			AA	151/750		1.79	Ref		
			AG	23/145		1.55	1.22(1.02–1.46)	2.92E-02	
			GG	0/7		0.86	4.27(1.90–9.59)	4.32E-04	
			AG+GG				1.25(1.05 - 1.50)	1.14E-02	
			Model free $\text{test}^d$					2.59E-04	1.50E-01
PT group	(n=657) <sup>c</sup>								
EGFR	MAP3KI	rs17661089		108/549	0.09				
			AA	96/449		1.92	Ref		
			AG	12/94		1.58	1.32(1.06, 1.65)	1.46E-02	
			GG	0/6		0.83	4.92(2.18, 11.12)	1.24E-04	
			AG+GG				1.38(1.11, 1.72)	3.79E-03	
			Model free $\text{test}^d$					5.24E-05	4.23E-02
EGFR	MAP3KI	rs16886403		108/549	0.11				
			AA	94/422		1.92	Ref		
			AG	14/117		1.68	1.31(1.06, 1.61)	1.10E-02	
			GG	0/10		66.0	2.62(1.39, 4.92)	2.79E-03	
			AG+GG				1.36(1.11, 1.66)	2.61E-03	
			Model free test <sup>d</sup>					7.82E-04	1.58E-01

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Pathway	Gene	SNP	Genotype	Alive/Death	MAF <sup>a</sup>	Median survival (years)	HR $(95\% \text{ CI})^b$	$p$ -value $^{b}$	q-value
EGFR	MAP3KI	rs726501		108/549	0.11				
			GG	94/422		1.92	Ref		
			GA	14/117		1.68	1.31(1.06, 1.61)	1.10E-02	
			AA	0/10		66.0	2.62(1.39, 4.92)	2.79E-03	
			GA+AA				1.36(1.11, 1.66)	2.61E-03	
			Model free $\text{test}^d$					7.82E-04	1.58E-01
EGFR	RAFI	rs11710163		108/549	0.08				
			AA	86/472		1.80	Ref		
			AG	22/73		2.18	0.62(0.49, 0.8)	2.02E-04	
			AG+GG				0.64(0.50, 0.82)	3.78E-04	
			Model free $\text{test}^d$					6.70E-04	1.58E-01
PG Group	(n=305) <sup>e</sup>								
EGFR	RAFI	rs11710163		27/278	0.08				
			AA	20/239		1.83	Ref		
			AG	6/38		2.23	0.55(0.38, 0.79)	1.09E-03	
			AG+GG				0.54(0.38, 0.77)	6.84E-04	
			Model free $\text{test}^d$					6.84E-04	1.98-01
EGFR	NRAS	rs1065634		27/278	0.05				
			AA	27/247		1.92	Ref		
			AG	0/30		1.67	1.92(1.30–2.83)	1.03E-03	
			AG+GG				1.91(1.30, 2.80)	1.00E-03	
			Model free $\text{test}^d$					1.00E-03	1.98-01
GSH	GPX5	rs451774		27/278	0.29				
			AA	9/148		1.66	Ref		
			AG	15/104		2.27	0.61(0.47, 0.79)	2.06E-04	
			GG	3/26		2.15	0.99(0.65, 1.51)	9.55E-01	
			AG+GG				0.67(0.52, 0.85)	1.06E-03	

be
free $\text{test}^d$
27/278
27/241
0/37
free test $d$

a Minor allele frequency.

b Hazard ratios (HRs), 95% confidence intervals (CIs), and p-values were calculated using COX regression analysis adjusted for gender, treatment modality, and stage for all patients; gender and treatment modality for the PT group; and gender, histological cell types, and treatment modality for the PG group.

 $^{\mathcal{C}}$  Platinum plus taxanes with or without other drugs.

 $d_{\mathrm{The}}$  association analysis was performed based on the genetic model free test (2 degrees of freedom).

<sup>e</sup>Platinum plus gemcitabine with or without other agents, not mutually exclusive from PT group.

#### Table 3

Chemotherapy agent-relevant pathway gene and overall survival

Pathway	Gene	Number of SNPs	Number of SNP captured 90% of the variability	p-value <sup>a</sup>
All patients (n=1077)				
EGFR	NRAS	14	10	6.09E-04
EGFR	MAP3K1	26	10	1.80E-02
GSH	GSTM1	2	2	2.75E-02
GSH	GSS	18	10	3.76E-02
DNA	RAD52	30	10	4.63E-02
PT group <sup><math>b</math></sup> (n=657)				
EGFR	MAP3K1	26	10	6.10E-03
EGFR	RAF1	22	9	3.14E-02
GSH	GPX5	12	8	3.18E-02
DNA	APEX1	10	8	3.20E-02
GSH	GSS	18	10	4.24E-02
GSH	GSTA5	14	9	4.34E-02
PG group <sup><math>C</math></sup> (n=305)				
GSH	GPX6	18	8	8.33E-05
GSH	GPX5	12	8	2.22E-04
EGFR	NRAS	14	10	3.50E-03
GSH	GPX7	12	6	4.70E-03
GSH	GCLC	40	10	2.93E-02
GSH	GSTM3	10	5	4.09E-02
DNA	RAD52	30	10	4.38E-02
EGFR	RAF1	22	9	4.49E-02
Taxa	MAPK9	38	10	4.87E-02

<sup>*a*</sup>P-values for the global tests summarizing the outcome of the PCA were calculated using a multivariable Cox proportional hazards regression model based on the genetic model free test. We adjusted for gender, treatment modality, and stage for all patients; gender and treatment modality for the PT group; and gender, histological cell types, and treatment modality for the PG group.

<sup>b</sup>Platinum plus taxanes with or without other drugs.

<sup>C</sup>Platinum plus gemcitabine with or without other agents, not mutually exclusive from the PT group.