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# **CANCER GENETICS AND EPIGENETICS**



# Genome-wide scan of long noncoding RNA single nucleotide polymorphisms and pancreatic cancer susceptibility

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[Correction added on 03 March 2021, after first online publication: affiliation for Silvia Carrara has been changed.]

Abbreviations: GWAS, genome wide association studies; LD, linkage disequilibrium; IncRNA, long noncoding RNA; IncSNPs, long noncoding RNA single nucleotide polymorphisms; MAF, minor allele frequency; miRNA, micro-RNA; ncRNA, noncoding RNA; PANDoRA, PANcreatic Disease ReseArch Consortium; PCA, principal component analysis; PDAC, pancreatic ductal adenocarcinoma: SNPs. single nucleotide polymorphisms.



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#### Abstract

Pancreatic ductal adenocarcinoma (PDAC) is projected to become the second cancerrelated cause of death by 2030. Identifying novel risk factors, including genetic risk loci, could be instrumental in risk stratification and implementation of prevention strategies. Long noncoding RNAs (IncRNAs) are involved in regulation of key biological processes, and the possible role of their genetic variability has been unexplored so far. Combining genome wide association studies and functional data, we investigated the genetic variability in all IncRNAs. We analyzed 9893 PDAC cases and 9969 controls and identified a genome-wide significant association between the rs7046076 SNP and risk of developing PDAC ( $P = 9.73 \times 10^{-9}$ ). This SNP is located in the *NONHSAG053086.2* (*Inc-SMC2-1*) gene and the risk allele is predicted to disrupt the binding of the IncRNA with the micro-RNA (miRNA) hsa-mir-1256 that regulates several genes involved in cell cycle, such as *CDKN2B*. The *CDKN2B* region is pleiotropic and its genetic variants have been associated with several human diseases, possibly though an imperfect interaction between IncRNA and miRNA. We present a novel PDAC risk locus, supported by a genome-wide statistical significance and a plausible biological mechanism.

#### KEYWORDS

association study, long noncoding RNA, pancreatic cancer, single nucleotide polymorphism

# 1 | INTRODUCTION

Pancreatic cancer and particularly pancreatic ductal adenocarcinoma (PDAC) is the fifth cause of cancer-related death in the western world,<sup>1</sup> and it is projected to become the second by 2030.<sup>2</sup> The incidence is almost equal to the mortality, with a survival around 10% at

5 years after diagnosis.<sup>3</sup> One of the reasons for this meager prognosis is the absence of specific symptoms, making early detection and diagnosis a hard challenge.<sup>4</sup> Additionally, surgery remains the only curative treatment, but only a minority of the patients can receive it, because most are diagnosed at advanced stage.<sup>5</sup> A possible strategy to reduce the burden of this disease would be to find biological risk markers that

enable a timely diagnosis, and/or the stratification of the population according to the risk in order to plan preventive strategies. Several epidemiologic PDAC risk factors have been identified, including cigarette smoking, heavy alcohol intake, type two diabetes mellitus and chronic pancreatitis.<sup>6,7</sup> In addition, several studies have identified body mass index as a causative factor for PDAC development using a Mendelian randomization approach.<sup>8-10</sup> The genetic susceptibility to PDAC is the result of the involvement of rare high penetrance mutations and high frequency low penetrance variants discovered through genome wide association studies (GWAS) or large multicentric candidate gene approaches.<sup>11-22</sup>

The recent advances in the knowledge on the regulatory regions of the human genome have highlighted that several GWAS hits associated with a variety of human traits, including PDAC risk, are located in DNA sequences containing noncoding RNA (ncRNA).<sup>23</sup> The vast majority of ncRNAs consists of long noncoding RNA (IncRNA), and recent evidences suggest that around 68% of the human transcriptome consists of IncRNAs.<sup>24</sup> IncRNAs are generally defined as RNA transcripts longer than 200 nucleotides with no protein-coding potential.<sup>25</sup> Although IncRNAs cannot encode any functional protein, they are involved in diverse biological processes, playing essential roles in maintaining cell growth, differentiation and proliferation.<sup>26,27</sup> There is an increasing amount of evidence suggesting their role in cancer development, progression and metastatic spread.<sup>27</sup> The involvement of IncRNAs in cancer could be the results of a plethora of mechanisms such as the regulation of gene expression (epigenetic, transcriptional and post-transcriptional) through the interaction with other regulatory molecules, such as micro-RNAs (miRNAs), and through the direct binding to protein complexes such as transcription factors. All these mechanisms have been reviewed by Slack and Chinnaivan.<sup>27</sup>

LncRNAs are highly polymorphic and single nucleotide polymorphisms (SNPs) localized in their sequence (IncSNPs) could influence their expression and therefore have an impact on their function as master regulators.<sup>28</sup> At least two PDAC risk loci, identified through GWAS, have been reported to be in IncRNAs (*LINC00673*-rs11655237, *LINC-PINT*-rs6971499), and examples also exist in other cancer types such as colorectal,<sup>29</sup> glioma,<sup>30</sup> lung,<sup>31</sup> hepatocellular carcinoma<sup>32</sup> and ovarian cancer.<sup>33</sup>

Despite these evidences, a systematic search of the effect of IncSNPs in the development of PDAC has never been attempted. With the aim of finding new susceptibility loci, we have scanned the entire human genome for SNPs in IncRNAs and analyzed their possible involvement in PDAC susceptibility by using a two-step study on 9893 cases and 9969 controls.

# 2 | MATERIALS AND METHODS

#### 2.1 | Study populations

For the discovery phase data from the published GWAS PanScan I, PanScan II and PanC4 were downloaded from the database of Genotypes and Phenotypes (dbGaP) website (study accession numbers:

## What's new?

Long non-coding RNAs (IncRNAs) are thought to contribute to cancer development. Here, the authors searched for new IncRNA variants that are associated with risk of pancreatic ductal adenocarcinoma (PDAC). From analysis of 15,000 individuals, they obtained 67 variants associated with PDAC risk. Some of these were located in genes previously associated with PDAC, an outcome which not only validates the method but could shed light on the functional relevance of these genes. The strongest association was to a variant in the *Inc-SMC2-1* gene, and the risk allele is predicted to disrupt cell cycle regulation.

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phs000206.v5.p3 and phs000648.v1.p1, project reference: #12644). All the individuals were genotyped using either Illumina Infinium HumanHap550v3 (PanScan I), Illumina Infinium Human610-Quad (PanScan II) or HumanOmniExpressExome-8v1 (PanC4) DNA Analysis Genotyping BeadChip. Each participating study (within PanScan I, PanScan II and PanC4) obtained informed consent from study participants, and approval from the responsible institutional review board, as described in the original papers.<sup>34-37</sup> After downloading the genotypes, we performed imputation and quality controls. Briefly, the genotypes were phased using SHAPEIT v2 software. The three GWAS data sets were imputed separately using IMPUTE4 with 1000 Genomes-phase 3 as the reference panel. Prior to imputation, quality control (OC) filters included: removal of individuals with gender mismatches, call rate < 0.98, minimal or excessive heterozygosity (>3 SDs from the mean) or cryptic relatedness (PI HAT > 0.2). SNPs with minor allele frequency (MAF) < 0.01, call rate < 0.98 or evidence for violations of Hardy-Weinberg Equilibrium ( $P < 1 \times 10^{-6}$ ) were excluded. Postimputation SNPs with low imputation guality (INFO score  $r^2 < 0.7$ ), MAF < 0.01 or call rate < 0.98 were excluded. Principal component analysis (PCA) was carried out with PLINK 2.0 (www. cog-genomics.org/plink/2.0/) including genotypes from all the populations of the phase 3 of the 1000 Genomes Project. Individuals not clustering in the PCA with the 1000 Genomes subjects of European descent were excluded from further analysis. For this phase, genotyping data of 14 269 individuals (7207 cases and 7062 controls) were used. The final data set had genotypes for 7 509 345 SNPs. Additional information regarding SNP filtering for each data set is shown in Table S1. The "inflation factor" did not showed evidence of systematic inflation ( $\lambda$  = 1.000 for PanScan I,  $\lambda$  = 1.015 for PanScan II,  $\lambda$  = 1.000 for PanC4, and  $\lambda$  = 1.000 for the aggregate data set). For the replication phase, the genotyping was conducted in 5593 individuals (2686 PDAC patients and 2907 controls) belonging to the PANcreatic Disease ReseArch Consortium (PANDoRA). PANDoRA has been described in detail elsewhere.<sup>38</sup> It is a multicentric study consisting of 11 European countries (Greece, Italy, Germany, Netherland, Denmark, Czech Republic, Hungary, Poland, Ukraine, Lithuania and

	PanScan	PanC4	PANDoRA	Total
Diagnosis				
Controls	3320	3742	2907	9893
PDAC cases	3274	3933	2686	9969
Total	6594	7675	5593	19 862
Median age (Q1-	Q3)			
Controls	65 (55-75)	65 (55-75)	59 (47-67)	65 (55-75)
PDAC cases	65 (65-75)	65 (55-75)	66 (58-73)	65 (55-75)
Sex				
Female	52%	57%	45%	52%
Male	48%	43%	55%	48%

Note: The age values in the PanScan and PanC4 data sets obtained from dbGaP were reported in 10-year categories. We used the value of 35 for the age of all subjects belonging to the 30 to 39 category. Likewise, for the other age categories we used 45, 55, 65, 75, and 85 years. Abbreviations: PANDoRA, PANcreatic Disease ReseArch Consortium; PDAC, pancreatic ductal adenocarcinoma.

United Kingdom), Brazil and Japan. PDAC cases were defined by an established diagnosis of PDAC and controls were individuals of the general population without a pancreatic disease at recruitment, individuals that were hospitalized for nontumor-related causes, or blood donors. For each subject, information on sex, age (age at diagnosis for cases and age at recruitment for controls) and country of origin was collected. The PANDoRA study protocol was approved by the Ethics Commission of the Medical Faculty of the University of Heidelberg. In accordance with the Declaration of Helsinki, written informed consent was obtained from each participant. A description of the populations used is shown in Table 1.

# 2.2 | Identification of IncRNA and IncSNPs

To obtain the list of all known human lncRNAs, the publicly available database NONCODE (http://www.noncode.org) was used. The database uses a Coding Noncoding Index algorithm to discriminate between ncRNA and protein-coding RNA through the coding potential of each transcript.<sup>39</sup> The database uses a unique nomenclature for the lncRNA, described in detail by Xie et al.<sup>40</sup> The NONCODE database was consulted on March 22, 2019 and the list consisted of 11 857 human lncRNAs. To identify all the lncSNPs in each of the sequences identified through NONCODE, we used LncRNASNP2 (http://bioinfo.life.hust.edu.cn/lncRNASNP#!/), a database of functional SNPs and mutations in human and mouse lncRNAs, obtaining a list of 10 205 295 lncSNPs.<sup>41</sup>

# 2.3 | Sample preparation and genotyping

DNA of PANDoRA cases and controls was extracted from whole blood, using the Qlamp 96 DNA QIAcube HT Kit (Qiagen, Hilden, Germany).

Genotyping was done using TaqMan technology (ThermoFisher Applied Biosystems, Waltham, Massachusetts) in 384-well plates according to manufacturer's recommendations. In each plate, an approximately equal number of cases and controls were used, and duplicate samples (8%) and no template controls were added for QC purposes. Genotyping calls were made using QuantStudio 5 Real-Time PCR system (Thermofisher) and QuantStudio software.

# 2.4 | Data filtering and statistical analysis

Out of the 10 205 295 IncSNPs identified through LncRNASNP2, 9 787 663 had MAF < 0.01 and were then discarded. Out of the remaining 417 632 IncSNPs, 121 555 were not present in the imputed PanScan + PanC4 data sets. The final list of variants used in the analysis consisted of 296 077 IncSNPs. The logistic analysis was carried out with PLINK 2.0 (www.cog-genomics.org/ plink/2.0/).

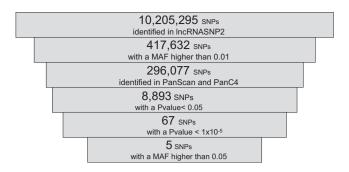
The five resulting independent SNPs with the lowest *P* values of association with PDAC risk were then genotyped in a population consisting of 2686 PDAC patients and 2907 controls from PANDoRA. We observed no deviation from Hardy-Weinberg equilibrium in any of the genotyped SNPs. The average call rate was 98%. This replication analysis was adjusted for sex, age and country of origin.

In addition, a gene-based analysis was performed through the MAGMA v1.08 software to test the association between all long non-coding genes and PDAC risk.<sup>42</sup>

Finally, a fixed effect meta-analysis between the results of the two phases was conducted in the 19 862 individuals included in the two study phases using R software package (https://cran.r-project. org/web/packages/rmeta). The Bonferroni-corrected threshold for statistical significance was  $0.05/296077 = 1.69 \times 10^{-7}$ .

## 2.5 | Bioinformatic tools

We used several databases to link the SNPs with the best associations with a potential functional explanation. To identify the possible effect of the SNPs on gene expression, we used the data available in the Genotype-Tissue Expression (GTEx) project (https://www. gtexportal.org). We used LncRNASNP2, miRbase (http://www. mirbase.org) (release 22) and miRDB 6.0 tool (http://mirdb.org) to identify potential interactions between IncRNAs and miRNAs to assess the potential effect on gene expression. We used HaploReg (https://pubs.broadinstitute.org/mammals/haploreg/haploreg.php) and RegulomedB (https://www.regulomedb.org) to test the regulatory potential (ie, possible change in transcription factors affinity, regulation of chromatin state). Finally, we used LDlink (https:// Idlink.nci.nih.gov) to explore the linkage disequilibrium (LD) between the variants we have identified and polymorphisms reported in the literature. We have also analyzed the regions nearby the significant SNPs to look for regulatory regions using the ensemble website (https://www.ensembl.org/).



**FIGURE 1** Selection/elimination process of the IncSNPs. IncSNPs, long noncoding RNA single nucleotide polymorphisms

## 3 | RESULTS

This study was performed using a two-phase approach, a discovery phase consisting of data on 7207 cases and 7062 controls from four GWAS conducted on PDAC risk (PanScan I. PanScan II and PanC4). and a validation phase, in which we performed de novo genotyping of the most significant SNPs, comprising 2686 PDAC patients and 2907 controls from the PANcreatic Disease ReseArch (PANDoRA) consortium. A description of the populations studied is shown in Table 1. We used the NONCODE and the LncRNASNP2 databases to establish a comprehensive list of 296 077 IncSNPs. By testing their associations in the first phase, we observed 8893 IncSNPs with a statistically significant association with PDAC risk considering a threshold of P < .05 (P values ranging from 5.06 × 10<sup>-19</sup> to .049). We applied a filter of  $P < 1 \times 10^{-4}$  in order to maximize the chances of reaching genome-wide significance in the combined PanScan + PanC4 + PAN-DoRA data set and observed 67 SNPs below that threshold (Table S2). We then pruned for residual LD among the IncSNPs and between the IncSNPs and variants already reported in the literature to be associated with risk of developing PDAC. Details of the associations with established and putative loci, as well as localizations of SNPs in IncRNAs and predictions of impact on IncRNA-miRNA binding, are reported in Table S3. We obtained five candidates (rs6931760, rs6489786, rs7046076, rs7663891, rs73335863) that were associated with PDAC risk with a  $P < 1 \times 10^{-4}$ , had MAF > 0.05 and were independent from known risk loci. Figure 1 shows a scheme of the selection/elimination process of the IncSNPs and Figure S1 shows regional plots for all the loci in the PanScan + PanC4 data set. The gene-based analysis using MAGMA revealed that 3108 long noncoding genes were associated to PDAC risk (P < .05) and 11 considering a Bonferroni-corrected threshold (0.05/11857 =  $4.22 \times 10^{-6}$ ). The top six genes overlap or have SNPs in LD with known PDAC risk loci. Our five candidates SNPs map to genes that have a range of P values (multitest of MAGMA) from  $6.06 \times 10^{-7}$  to  $3.25 \times 10^{-4}$ . In particular, the NONHSAG053086.2 gene, where rs7046076 maps, showed an association with a very strong statistical significance  $P = 6.06 \times 10^{-7}$ . The results for all the genes showing statistically significant associations are listed in Table S4.

In the replication phase, the five SNPs were tested in the PAN-DoRA population. We observed that the C allele of rs7046076 was associated with an increase in PDAC risk in the additive model (OR<sub>add</sub> = 1.14, 95% CI = 1.04-1.24, P = .004) and in the codominant model (OR<sub>[C/C vs T/T]</sub> = 1.33, 95% CI = 1.09-1.62, P = .005).

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The results were meta-analyzed with the data from the discovery phase and we found a genome-wide significant risk associated with the C allele of the rs7046076 SNP ( $OR_{add} = 1.13, 95\%$  CI = 1.09-1.18,  $P = 9.73 \times 10^{-9}$ ). Table 2 shows the results of the discovery phase, of the validation phase and of the meta-analysis for the five SNPs that were genotyped in PANDoRA. Figure 2 shows the meta-analysis for rs7046076. In addition, we have also checked the results of the five SNPs in a pancreatic cancer GWAS conducted in the Japanese population and we observed that rs7663891 showed an association with the risk of developing the disease, with the estimate that goes in the same direction of our replication phase (OR = 1.08, 95% CI = 1.07-1.09 and P = .0499)<sup>14</sup> but not of the discovery phase.

We investigated the functional potential of rs7046076 with all the tools described in the methods section. GTEx and Haploreg showed that rs7046076 is a multitissue eQTL, with no statistically significant association in the pancreatic tissue. According to the LncRNASNP2 website, rs7046076 lies in the *NONHSAG053086.2* lncRNA that binds to the hsa-mir-1256, which according to miRDB regulates 381 genes. The C allele of rs7046076 disrupts the binding between *NONHSAG053086.2* and hsa-mir-1256, with  $\Delta\Delta G = -17.46$  kCal/mol (predicted by LncRNASNP2). LDlink showed that rs4742902, that is in LD with rs7046076 ( $r^2 = 0.83$  in the European populations of 1000 Genomes), has a RegulomeBD rank of 2b and a score of 0.84, indicating that the SNP probably binds to a transcription factor and is situated in a region sensible to DNases. Using Ensembl, we found that nearby the five SNPs there are several regulatory regions (Table S5).

# 4 | DISCUSSION

In the last decade, GWAS have been an invaluable tool to identify thousands of susceptibility loci in many human complex traits; however, they suffer from two inherent problems: (a) the majority of the identified SNPs are situated in noncoding region that make their functional interpretation difficult, and (b) considering the stringent statistical threshold imposed by multiple comparisons (usually  $P < 5 \times 10^{-8}$ ), only the top results are usually reported, possibly leaving out a large number of false negatives. To overcome these limitations, in our study we combined GWAS and functional data in order to identify novel variants involved in PDAC susceptibility. We focused on lncRNAs because they are an emergent biomarker in a plethora of human diseases.

LncRNA deregulation plays a key role in different human cancers, including PDAC.<sup>26,27,43,44</sup> The molecular mechanisms through which lncRNA could affect cancer development, progression and metastatic spread are multiple and include regulatory interactions with DNA, RNA (mRNAs and miRNAs) and proteins (eg, transcription factors and chromatin modifying complexes).<sup>3,27</sup>

In the last years, several in vitro studies have shown that deregulation of IncRNA expression patterns plays an essential role in growth,

								Additive model		M/m vs M/M		m/m vs M/M	
SNP (M/m)	Phase	Phase N. Co/Ca	MAF Co	MAF Co MAF Ca Hom	Hom Co/Ca	Het Co/Ca	Hom Co/Ca	OR (95% CI)	P value	OR (95% CI)	P value	OR (95% CI)	P value
rs7663891 (T/C)	Dis.	6936/7081	30.05%		28.12% 3402/3668	2899/2843	635/570	0.90 (0.86-0.95)	$8.73\times10^{-5}$	0.90 (0.84-0.97)	.003	0.82 (0.72-0.92)	.001
	Rep.	2885/2670	30.99%	30.97%	1392/1262	1198/1162	295/246	1.04 (0.95-1.13)	.418	1.09 (0.97-1.23)	.149	1.01 (0.82-1.23)	.931
	Met.	9821/9751	30.33%	28.90%	9821/9751 30.33% 28.90% 4794/4930	4097/4005	930/816	0.96 (0.84-1.11)	.602	0.98 (0.82-1.19)	.870	0.90 (0.73-1.10)	.283
Imputation score	PanScal	PanScan-I: 0.989, PanScan II: 0.988, PanC4: 0.998	Scan II: 0.9	38, PanC4:	0.998								
rs6931760 (G/C)	Dis.	6998/7147 31.74% 29.66% 3287/3559	31.74%	29.66%	3287/3559	2980/2937	731/651	0.90 (0.85-0.95)	$3.43 \times 10^{-5}$	0.90 (0.84-0.96)	.003	0.81 (0.72-0.91)	$3.33 \times 10^{-4}$
	Rep.	2663/2562	35.43%	33.65%	2663/2562 35.43% 33.65% 1141/1140	1157/1120	365/302	0.93 (0.85-1.01)	.093	0.96 (0.85-1.09)	.568	0.84 (0.69-1.01)	.064
	Met.	Met. 9661/9709 32.76% 30.71% 4428/4699	32.76%	30.71%	4428/4699	4137/4057	1096/953	0.91 (0.87-0.95)	$5.96  imes 10^{-5}$	0.91 (0.86-0.97)	.002	0.82 (0.74-0.90)	$8.01  imes 10^{-5}$
Imputation score	PanScal	PanScan-I: 0.996, PanScan-II: 0.995, PanC4: 0.997	Scan-II: 0.9	95, PanC4:	0.997								
rs7046076 (T/C)	Dis.	7038/7187	31.00%	33.78%	7038/7187 31.00% 33.78% 3346/3172	3020/3175	672/840	1.13 (1.08-1.19)	$9.73 \times 10^{-7}$	1.11 (1.03-1.19)	.004	1.31 (1.17-1.47)	$2.39  imes 10^{-6}$
	Rep.	2839/2648	29.99%	32.91%	2839/2648 29.99% 32.91% 1394/1198	1187/1157	258/293	1.14 (1.04-1.24)	.004	1.11 (0.98-1.25)	.102	1.33 (1.09-1.62)	.005
	Met.	Met. 9877/9835 30.71% 33.54% 4740/4370	30.71%	33.54%	4740/4370	4207/4332	930/1133	1.13 (1.09-1.18)	$9.73  imes 10^{-9}$	1.11 (1.04-1.18)	$9.87  imes 10^{-4}$	1.32 (1.19-1.45)	$5.75  imes 10^{-8}$
Imputation score	PanScal	PanScan-I: 1.000, PanScan-II: 1.000, PanC4: 1.000	Scan-II: 1.0	00, PanC4:	1.000								
rs6489786 (G/A)	Dis.	Dis. 7014/7162 34.82% 37.32% 2976/2831	34.82%	37.32%	2976/2831	3191/3316	847/1015	1.11 (1.05-1.16)	$5.84  imes 10^{-5}$	1.08 (1.01-1.16)	.024	1.24 (1.11-1.38)	$6.81  imes 10^{-5}$
	Rep.	2836/2639	36.05%	37.27%	2836/2639 36.05% 37.27% 1171/1058	1285/1195	380/386	1.04 (0.92-1.18)	.197	1.04 (0.92-1.18)	.524	1.13 (0.94-1.35)	.188
	Met.	9850/9801 35.18% 37.31% 4147/3889	35.18%	37.31%	4147/3889	4476/4511	1227/1401	1.10 (1.05-1.15)	$5.31  imes 10^{-5}$	1.07 (1.01-1.14)	.028	1.21 (1.10-1.33)	$6.31 \times 10^{-5}$
Imputation score	PanScal	PanScan-I: 0.999, PanScan-II: 0.998, PanC4: 0.999	Scan-II: 0.9	98, PanC4:	0.999								
rs73335863 (T/C)		Dis. 6514/6628	4.54%		5.71% 5937/5897	563/705	14/26	1.27 (1.13-1.41)	$2.64 \times 10^{-5}$	1.26 (1.12-1.41)	$1.18  imes 10^{-4}$	1.8 (0.94-3.46)	.076
	Rep.	2848/2636	6.62%		6.87% 2496/2290	327/330	25/16	1.03 (0.88-1.21)	.686	1.06 (0.89-1.26)	.537	0.90 (0.46-1.76)	.755
	Met.	9362/9264	5.17%	6.04%	6.04% 8433/8187	890/1035	39/42	1.15 (0.94-1.42)	.173	1.17 (0.99-1.38)	.065	1.28 (0.65-2.52)	.478
Imputation score	PanScal	PanScan-I: 0.950, PanScan-II: 0.946, PanC4: 0.946	Scan-II: 0.9	46, PanC4:	0.946								
Note: All analyses were adjusted by age, sex, and the first eight principal model for SNPs showing heterogeneity (rs7663891 and rs73335863).	rre adjust€ ∕ing heter	ed by age, sex, ogeneity (rs76	and the firs 63891 and	t eight prin rs7333586	ncipal compone (3).	ents. Meta-ana	lysis was perfc	components. Meta-analysis was performed applying the fixed-effects model (rs6931760, rs7046076 and rs6489786) or random-effects	fixed-effects r	nodel (rs6931760,	rs7046076 and	d rs6489786) or ra	ndom-effects
	D												

**TABLE 2** Case-control analysis of the five candidate SNPs selected after the discovery phase of the study

Abbreviations: Ca, cases; Co, controls; Dis., discovery phase; M, major allele; m, minor allele; M/m vs M/M and m/m vs M/M, codominant model; MAF, minor allele frequency; Met., meta-analysis; OR, odds ratio; Rep., replication phase; SNPs, single nucleotide polymorphisms.

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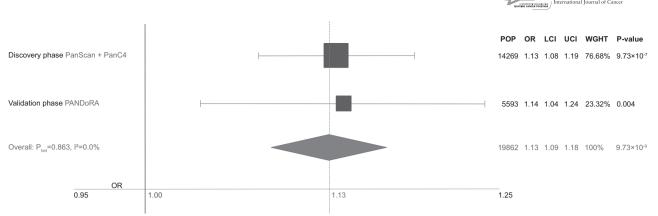
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**FIGURE 2** Meta-analysis for rs7046076. *Discovery phase*: PanScan + PanC4; *Validation phase*: PANDoRA; *POP*: number of cases + controls; *WGHT*: relative weight of the meta-analysis components; *P value*: association with PDAC risk; *Overall P<sub>het</sub>and I*<sup>2</sup>: measures of heterogeneity between the meta-analysis components. LCI, lower bound of the 95% confidence interval; OR, odds ratio; PDAC, pancreatic ductal adenocarcinoma; UCI, upper bound of the 95% confidence interval

invasive and metastatic potential of PDAC cells, as reviewed by Huang et al.<sup>26</sup> In particular, IncRNA-miRNA interactions seem to be of primary importance in PDAC aggressiveness.<sup>26</sup> Recent evidences suggest that functional polymorphisms, regulating IncRNA expression, could play a decisive role in modulating the risk of developing several cancer types.<sup>29-33,45</sup> With these premises, we investigated the genetic variability of IncRNAs across the genome in relation to PDAC risk.

We used a two-phase approach and analyzing almost 15 000 individuals in the discovery phase we identified 67 lncSNPs that were associated with PDAC risk ( $P < 1 \times 10^{-4}$ ); filtering for residual LD and possible association with known loci we ended up with a list of five variants to be tested in a validation phase.

The strongest association we observed, from a statistical point of view, is the increase in risk of developing PDAC associated with the C allele of the rs7046076 variant. This SNP was significant in both study phases and reaches genome-wide significance (P =  $9.73 \times 10^{-9}$ ) in the meta-analysis of the two phases. rs7046076 is in the region of SMC2, a locus previously reported as suggestively associated with PDAC risk,<sup>11</sup> and is in moderate LD ( $r^2 = 0.79$ , D' = 1) with rs10991043, the top SNP reported in that locus. This SNP maps to the NON-HSAG053086.2 IncRNA (also known as Inc-SMC2-1) that lies on chromosome 9q31.2 (at position 106 786 881, hg38), more than 2.6 megabases away from the well-known ABO-rs505922 locus at 9g34  $(r^2 = 0$  in the populations of European descent of 1000 Genomes). NONHSAG053086.2 binds to a miRNA (hsa-mir-1256), which is expressed in several tissues, including pancreatic tissue, and regulates 381 genes. Among the genes with the highest score for binding with hsa-mir-1256, there are CDKN2B and DAAM1. CDKN2B lies on 9p21.3, a pleiotropic stretch of DNA that includes in addition to CDKN2B also CDKN2A and CDKN2B-AS1, and has a very complex genomic context and regulation. There are convincing epidemiologic and molecular evidences pointing to a key role for the region in cancer etiology. For example, the CDKN2A gene is frequently mutated in PDAC,<sup>46</sup> while CDKN2B genetic germline variability has been consistently shown by us and others to be associated with risk of PDAC and pancreatic neuroendocrine tumors.<sup>12,47,48</sup> The presence of the rs7046076 C allele causes the loss of miRNA-lncRNA binding (as shown in the LncRNASNP2 database), and therefore could be involved in the deregulation of the genes on 9p21.3 increasing PDAC risk. In addition, NONHSAG053086.2 regulates DAAM1 (14q23.1) through the binding with hsa-mir-1256. The protein encoded by this gene promotes directional vesicular transport and facilitates cell movement. Ang et al have shown that the loss of this protein could lead to random migration of the cell,<sup>49</sup> and a perturbation of DAAM1 regulation has been reported to facilitate cancer progression and metastasis through random cell migration.<sup>50</sup> Moreover, using the MAGMA software, an association with NONHSAG053086.2 gene, where rs7046076 maps, and PDAC risk was highlighted with a p multi of  $6.06 \times 10^{-7}$ . All these evidences confirm that this locus is associated with the PDAC risk. Using Ensembl, we observed the presence of are several putatively regulatory regions with variants in LD with the top five SNPs. These regions seem to have a role in the pancreatic tissues, it is however, difficult to directly link their effect with the variation determined by the SNPs. Follow-up studies aimed of uncovering the effect of the polymorphisms, especially rs7046076 are therefore warranted.

It is noteworthy that our approach selected a number of SNPs belonging to loci that were previously reported to be associated with PDAC risk, either as established loci (ie, significant at genome-wide level) or as suggestive ones. This implies that (a) our approach is valid because it successfully identifies known risk loci, and (b) it can shed light to associations previously reported but lacking possible functional explanations.

For example, rs9543325 ( $P = 5.06 \times 10^{-19}$  in the discovery set), one of the IncSNPs discarded through LD filtering, maps to the locus 13q22.1, and is the same reported by Petersen et al in 2010 in the PanScan II GWAS.<sup>35</sup> The authors stated that the SNP maps to a nongenic region between *KLF2* and *KLF5* without explaining the function. Conversely herein we have identified that rs9543325 maps to the gene of IncRNA, *NONHSAG067118.1*, which gives a possible functional explanation to this finding.

Additional established PDAC risk loci where SNPs identified with our approach map are NR5A2 (chromosome 1q32.1), ETAA1 (2p14), TERT-CLPTM1L (5p15.33), ABO (9q34.2) and BCAR



(16q23.1). Additionally, one of the SNPs we selected for genotyping in PANDoRA (rs7663891) is in the region of *EDNRA* (chromosome 4q31.22), which was reported to be suggestively associated with PDAC risk,<sup>11</sup> although the association is not confirmed in our replication phase. One quarter of all known PDAC risk loci are linked to IncRNA function. In addition, gene-based analysis performed with MAGMA also supported the involvement of IncRNAs in PDAC etiology, considering that 3108 out of 11 857 IncRNA genes showed a statistically significant association with the disease. This clearly highlights the importance of these molecules in the pathology and emphasizes the need to further our knowledge on their interaction with miRNAs and other functional mechanisms.

Obvious strengths of our study are its large size and the rigorous two-phase approach that contribute to decreasing the possibilities of spurious findings. In addition, we performed a comprehensive analysis of the common genetic variability in human IncRNAs, an attempt that has never been tried before.

A possible limitation is that only individuals of Caucasian descent were included and therefore we used published data of a GWAS conducted in PDAC, in the Japanese population, to check the association of our top findings. Only rs7663891 showed a statistically significant association at the nominal *P* value level (P = .0499).<sup>14</sup> Different findings in genetic association studies conducted in population of different ethnicities are frequent and have already been documented in PDAC susceptibility.<sup>16</sup> In addition, the functional explanations that support our findings are derived from databases and not by direct evidence from experimental results.

In conclusion, we present here a novel PDAC risk locus supported by a genome-wide statistical significance and a plausible biological mechanism, pointing to the interplay of IncRNAs and miRNAs in the maintenance of cellular homeostasis and suggesting that subtle deregulation of these mechanisms by IncSNPs can lead to cancer. This finding improves our knowledge of genetic factors associated with PDAC risk and reinforces the role of IncSNPs in the susceptibility to PDAC.

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# CONFLICT OF INTEREST

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#### DATA AVAILABILITY STATEMENT

The PanScan and PanC4 genotyping data are available from the database of Genotypes and Phenotypes (dbGaP, study accession numbers phs000206.v5.p3 and phs000648.v1.p1). The PANDoRA primary data for this work will be made available to researchers who submit a reasonable request to the corresponding author, conditional to approval by the PANDoRA Steering Committee and Ethics Commission of the Medical Faculty of the University of Heidelberg. Data will be stripped from all information allowing identification of study participants.

### ETHICS STATEMENT

Each participating study obtained approval from the responsible institutional review board (IRB) and IRB certification permitting data sharing in accordance with the NIH Policy for sharing of Data Obtained in NIH-Supported or NIH-Conducted Genome Wide Association Studies. The PANDoRA study protocol was approved by the Ethics Commission of the Medical Faculty of the University of Heidelberg. In accordance with the Declaration of Helsinki, written informed consent was obtained from each participant.

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