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## Encoding the Odor of Cigarette Smoke

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# Encoding the Odor of Cigarette Smoke

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The encoding of odors is believed to begin as a combinatorial code consisting of distinct patterns of responses from odorant receptors (ORs), trace-amine associated receptors (TAARs), or both. To determine how specific response patterns arise requires detecting patterns *in vivo* and understanding how the components of an odor, which are nearly always mixtures of odorants, give rise to parts of the pattern. Cigarette smoke, a common and clinically relevant odor consisting of >400 odorants, evokes responses from 144 ORs and 3 TAARs in freely behaving male and female mice, the first example of *in vivo* responses of both ORs and TAARs to an odor. As expected, a simplified artificial mimic of cigarette smoke odor tested at low concentration to identify highly sensitive receptors evokes responses from four ORs, all also responsive to cigarette smoke. Human subjects of either sex identify 1-pentanethiol as the odorant most critical for perception of the artificial mimic; and in mice the OR response patterns to these two odors are significantly similar. Fifty-eight ORs respond to the headspace above 25% 1-pentanethiol, including 9 ORs responsive to cigarette smoke. The response patterns to both cigarette smoke and 1-pentanethiol have strongly responsive ORs spread widely across OR sequence diversity, consistent with most other combinatorial codes previously measured *in vivo*. The encoding of cigarette smoke is accomplished by a broad receptor response pattern, and 1-pentanethiol is responsible for a small subset of the responsive ORs in this combinatorial code.

**Key words:** GPCR; olfaction; perception; sensory; physiology; smoking

## Significance Statement

Complex odors are usually perceived as distinct odor objects. Cigarette smoke is the first complex odor whose *in vivo* receptor response pattern has been measured. It is also the first pattern shown to include responses from both odorant receptors and trace-amine associated receptors, confirming that the encoding of complex odors can be enriched by signals coming through both families of receptors. Measures of human perception and mouse receptor physiology agree that 1-pentanethiol is a critical component of a simplified odorant mixture designed to mimic cigarette smoke odor. Its receptor response pattern helps to link those of the artificial mimic and real cigarette smoke, consistent with expectations about perceptual similarity arising from shared elements in receptor response patterns.

## Introduction

Natural odors are mixtures of many species of volatile chemicals, known as odorants. Odors are initially encoded as “combinatorial codes” consisting of the response patterns of receptor proteins located in the cilia of olfactory sensory neurons (OSNs) (Malnic et al., 1999; Nara et al., 2011). The majority of odorant-responsive receptors are the odorant receptors (ORs), which

number in the hundreds in most mammals and ~1100 in mice (Buck and Axel, 1991; Niimura et al., 2014). Also important for odor detection are trace amine-associated receptors (TAARs). In mice, all but one of the 15 TAARs are expressed in OSNs where they are important for detecting volatile amines (Liberles and Buck, 2006; Ferrero et al., 2012; Johnson et al., 2012; Dewan et al., 2018). Each mouse OSN expresses just one allele of one OR or TAAR gene (Chess et al., 1994; Mombaerts, 2004; Liberles, 2015). This maximizes the distinctiveness of each OSN's response and allows each olfactory bulb glomerulus to be innervated only by axons of OSNs expressing the same OR or TAAR (Mombaerts et al., 1996), so that receptor response patterns can be represented faithfully in spatiotemporal patterns of glomerular activity.

We understand little about how OR and TAAR response patterns contribute to perception. For example, are response patterns similar for odors that have similar percepts? Are response

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T.S.M. has an equity interest in a company based on technologies used to measure responses to odors. The remaining authors declare no competing financial interests.

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patterns to complex odors necessarily broad, or do antagonistic interactions between odorants at receptors (de March et al., 2020) cause complex odors to have narrow response patterns? Are response patterns determined by only a few of the odorants in a complex odor? Are there core sets of odorants and receptors that determine perception of odors? This idea of core sets of receptors for percepts is consistent with the ability of chemists to mimic the percept evoked by a complex odor with just a few of its odorants (Tamura et al., 2008) and with concentration-invariant perception of odors (Friedrich and Korsching, 1997; Rubin and Katz, 1999; Meister and Bonhoeffer, 2001; Wachowiak and Cohen, 2001; Fried et al., 2002; Bozza et al., 2004; Storace and Cohen, 2017; Bolding and Franks, 2018). In this study, we investigated the receptor response pattern of a complex odor and the contribution of one of its odorants.

To focus our efforts on an odor significant to humans, we investigated cigarette smoke. Not only is it a common odor, it has clinical importance. In smokers and reformed smokers, the odor of cigarette smoke increases the desire to smoke (Cortese et al., 2015a,b). The link between the olfactory system and the brain's reward circuit has become hijacked by nicotine's activation of the reward circuit during exposure to cigarette smoke (Picciotto and Mineur, 2014; Balfour, 2015). This physiological response contributes to the difficulty smokers encounter when they attempt smoking cessation (Halpern et al., 2018; Hajek et al., 2019). Exposing freely behaving mice to cigarette smoke evokes a broad response pattern containing both ORs and TAARs. A small subset of these ORs comprise the response pattern to a low concentration of an artificial mimic of cigarette smoke odor. One of the odorants in this mimic, 1-pentanethiol, is especially important for human perception of artificial cigarette smoke odor and drives responses from several of the mouse ORs responsive to artificial cigarette smoke and to real cigarette smoke.

## Materials and Methods

**Materials.** Odorants were obtained at the highest purity available. Indole and butyric acid were kind gifts from Firmenich SA. Thiophene and 1,3-cyclohexadiene were purchased from Alfa Aesar. All other odorants were purchased from Sigma Millipore. An artificial cigarette smoke odor designed to mimic the odor of cigarette smoke (Dravnieks et al., 1975) was formulated by mixing 26 odorants at the proportions shown in Table 1. This artificial cigarette smoke odor should not be confused with commercial products mimicking cigarettes or cigarette smoke. Such products are designed to mimic certain properties of cigarettes, such as visual appearance, but not their odor.

**Human subject testing.** The procedures used for human subjects were approved by the University of Kentucky Institutional Review Board. Male and female volunteers ages 18–50 from the Lexington, KY consented in writing to participate in this study. Smokers, pregnant women, persons with active sinus infections, persons with a history of smell or taste deficits, persons suffering from fragrance allergies or chemical sensitivity, persons with a history of migraines headaches, and persons with a diagnosed neurologic disorder were excluded.

Tests of similarity between artificial cigarette smoke odor and odorant depletion mixtures lacking one of the odorants in artificial cigarette smoke odor were done by 18 consenting subjects: 10 females and 8 males. A total of 27 odor mixtures were prepared: the full artificial cigarette smoke odor mixture and 26 mixtures, each lacking one of the 26 odorants in the full mixtures. The mixtures were prepared fresh on the day of testing and absorbed into cotton balls sealed in brown glass vials. Subjects were seated in front of Movex fume capture hoods used to prevent odors from filling the testing room and causing adaptation. Subjects were first asked to familiarize themselves with the artificial cigarette smoke odor. Using intervals of at least 1 min between odor

**Table 1. Formulation of artificial cigarette smoke odor<sup>a</sup>**

Odorant	CAS #	Volume (μl)
Pyridine	110–86-1	5
Nicotinaldehyde	500–22-1	15
5-Ethyl-2-methylpyridine	104–90-5	30
2-Vinylpyridine	100–69-6	5
4-Pyridinecarbonitrile	100–48-1	5 mg
Methyl isonicotinate	2459–09-8	30
2-Ethyl-3-methylpyrazine	15707–23-0	20
2-Methoxy-3,5-methylpyrazine	93905–03-4	4
2-Methoxyphenol	90–05-1	15
o-Cresol	95–48-7	5
5-Methylfurfural	620–02-0	15
2,5-Dimethylpyrrole	625–84-3	30
Phenylacetylene	536–74-3	15
Isoprene	78–79-5	15
1,3-Cyclohexadiene	592–57-4	5
Indene	95–13-6	15
Allylbenzene	300–57-2	15
2,3-Butanedione	431–03-8	10
Thiophene	110–02-1	5
1-Pentanethiol	110–66-7	2.5
Allylamine	107–11-9	2.5
1-Aminopentane	110–58-7	2.5
Butyric acid	107–92-6	10
1-Hexanal	66–25-1	5
Trans,trans-2,4-Hexadienal	142–83-6	5
Indole	120–72-9	5 mg

<sup>a</sup>Indole and 4-pyridinecarbonitrile were dissolved at 0.5 mg/μl in DMSO and 10 μl of each added to the mixture.

sampling, each subject was given each of the depleted odorant mixtures in an order uniquely randomized for each subject. Subjects scored these mixtures using a method modeled after those of Keller and Vosshall (2016). The similarity of each odorant-deficient mixture to the full mixture was scored on a scale of 0 to 100, with 0 representing no similarity and 100 representing identical sensations.

Another 27 consenting subjects, 17 females and 10 males, were used to test whether individual odorants were discriminably different from the artificial cigarette smoke odor mixture. Subjects were seated in front of Movex fume capture hoods and asked to familiarize themselves with the odor of the full artificial cigarette smoke odor mixture. Using intervals of at least 1 min between odorants, each subject was given an odorant to sample and asked to rate its similarity to the full synthetic cigarette smoke odor mixture on a scale of 0 to 100. Subjects then also rated their perception of the pleasantness of each odorant, again using a scale of 0 to 100, with 0 being the most unpleasant odor imaginable and 100 being the most pleasant odor they could imagine. Each subject sampled the odors in a unique random order.

**Detection of OR and TAAR responses in live mice.** In this assay, odor stimulated expression of GFP from the activity-dependent *S100A5* gene locus in the *S100a5-tauGFP* mouse (The Jackson Laboratory, stock #006709). The *S100a5-tauGFP<sup>+/+</sup>* mice used for this project are from a stock back-crossed for 10 generations against C57BL/6J. Both sexes of mice, ages 7–12 weeks, were used. All procedures with mice were done according to protocols approved by the Institutional Animal Care and Use Committee of the University of Kentucky. GFP<sup>+</sup> and GFP<sup>−</sup> cell samples were collected by FACS of dissociated olfactory mucosae of heterozygous *S100a5-tauGFP* mice after stimulation with odor or with clean air. Because each OSN only expresses a single OR or TAAR gene, the OR and TAAR mRNAs specifically enriched in samples from mice stimulated with odorant but not in samples from mice stimulated with clean air must encode receptors responsive to the odorants tested. The reliability of this assay of receptor responses to odorants in freely behaving mice has been confirmed by *in vitro* studies of individual OR responses expressed in cultured cells (McClintock et al., 2014; de March et al., 2020).

Each mouse was housed individually in specially designed, heated (27°C) Plexiglas chambers (700 cm<sup>3</sup>) under a flow of 3.1 l/min of filtered air for 40 h to allow degradation of GFP evoked by prior odor exposure. Over the last 16 h of this 40 h period, the mice were stimulated by activating computer-controlled solenoid valves that divert the flow of filtered air to flush the headspace from a 50 ml Delrin vial containing 5 ml of either the DMSO vehicle or 25% 1-pentanethiol in DMSO. GFP fluorescence in an activated OSN peaks at 6–8 h after the onset of stimulation and because GFP has a 26 h half-life (Corish and Tyler-Smith, 1999) once an OSN responds to an odor it is marked for longer than the duration of the experiment. To stimulate with cigarette smoke, a 590 cm<sup>3</sup> Plexiglas cylinder closed at the bottom and containing a lit 1R6F Research Cigarette (produced by the Center for Tobacco Reference Products at the University of Kentucky) was secured against the wire mesh bottom of each mouse chamber for 1 min and the airflow to each chamber was discontinued, allowing smoke to enter the mouse chamber. For control mice, the same cylinder was used but it contained no cigarette. This procedure began 16 h before death of the mice and was done 6 times with 30 min between stimulations. This same procedure was used for stimulation with artificial cigarette smoke odor, using 0.6 ml of the artificial cigarette smoke odor source mixture or a nonvolatile vehicle (DMSO) soaked into a cotton ball as the stimuli. At the completion of stimulation, olfactory mucosae were dissected and cells dissociated in a procedure involving papain, trypsin, deoxyribonuclease, and low calcium saline as described previously (Yu et al., 2005; Sammeta et al., 2007). Cells from three identically treated mice were pooled, and FACS was performed in the University of Kentucky Flow Cytometry and Cell Sorting Facility using an iCyt Synergy cell sorting system to collect GFP<sup>+</sup> and GFP<sup>-</sup> cell samples. Total RNA was isolated using the QIAGEN RNeasy Micro kit (catalog #74004). RNA quantity was measured using Affymetrix Mouse Clariom S arrays in the University of Kentucky Microarray Facility. The microarray data are available in Gene Expression Omnibus under accession number GSE146418. Data were initially processed using Affymetrix GeneChip Command Console software to generate globally normalized quantities for each gene transcript cluster. Additional processing to generate GFP<sup>+</sup>/GFP<sup>-</sup> ratios from the microarray signal intensities was done in Microsoft Excel. These GFP<sup>+</sup>/GFP<sup>-</sup> enrichment ratios are equivalent to fold differences and help to normalize effect across the different abundances of mRNAs and across differences in constitutive activity of ORs and TAARs. The median signal intensity of 135 mature OSN-specific mRNAs (Nickell et al., 2012) was used to adjust for differences in the amount of mature OSNs across samples.

**Experimental design and statistical analysis.** Both human subject experiments were shared control designs where each condition was compared with a single common control, which in both cases was the full artificial cigarette smoke odor mixture. The test administrator was blind to the identities of the odors, each being identified only by a unique code on the odor vial. A different person performed statistical analyses of these data and was also blind to the identity of the odorants represented by the unique codes. Rating scores for each individual were converted to rankings and analyzed by estimation statistics for effect size using a shared control model for mean differences (<http://www.estimationstats.com/#/analyze/shared-control>). Effect sizes and CIs were calculated and are displayed. The *p* values reported for the effect sizes derive from Welch's unequal variance *t* test (Welch, 1947).

The *in vivo* assay design was a paired comparison of a group of 3 mice of either or both sexes exposed to odor to a sex- and age-matched group of 3 mice simultaneously exposed to filtered air, replicated 4 times. For analysis of these data, we used a Bayesian hierarchical model to obtain normalized measures of odorant effect, accounting for four sources of variation: basal receptor effect, odorant effect, nonspecific effect (change in both odorant and vehicle control), and random measurement error. For each odorant effect, the posterior mean divided by the posterior SD provides a measure (*Z* statistic) that is approximately normally distributed. Local false discovery rates (FDRs) (Efron, 2008; Stephens, 2017) were used to estimate the probability that each receptor was responsive to the odorant using a uniform mixture model. Based on the identification of responses from ORs whose agonists were identified

using independent methods, a 15% FDR was found to be a suitable level of risk for the identification of activated receptors (McClintock et al., 2014). Data for each receptor mRNA are reported as the GFP<sup>+</sup>/GFP<sup>-</sup> ratio fold differences for odor-stimulated mice and for control mice. The overall response measure (*delta*) is the GFP<sup>+</sup>/GFP<sup>-</sup> ratio fold difference for odor-stimulated mice divided by the GFP<sup>+</sup>/GFP<sup>-</sup> ratio fold difference for control mice. Responsive ORs show a large *delta* value because their mRNAs increase in the GFP<sup>+</sup> sample while simultaneously decreasing in the GFP<sup>-</sup> samples from odor-stimulated mice, but not in samples from control mice. Phylogenetic tree plots of OR sequence distance were generated in R. Dendrograms of the relationships between OR family size and the fraction of responsive ORs per family were generated using hierarchical clustering (Euclidean distance) functions from the R cluster library.

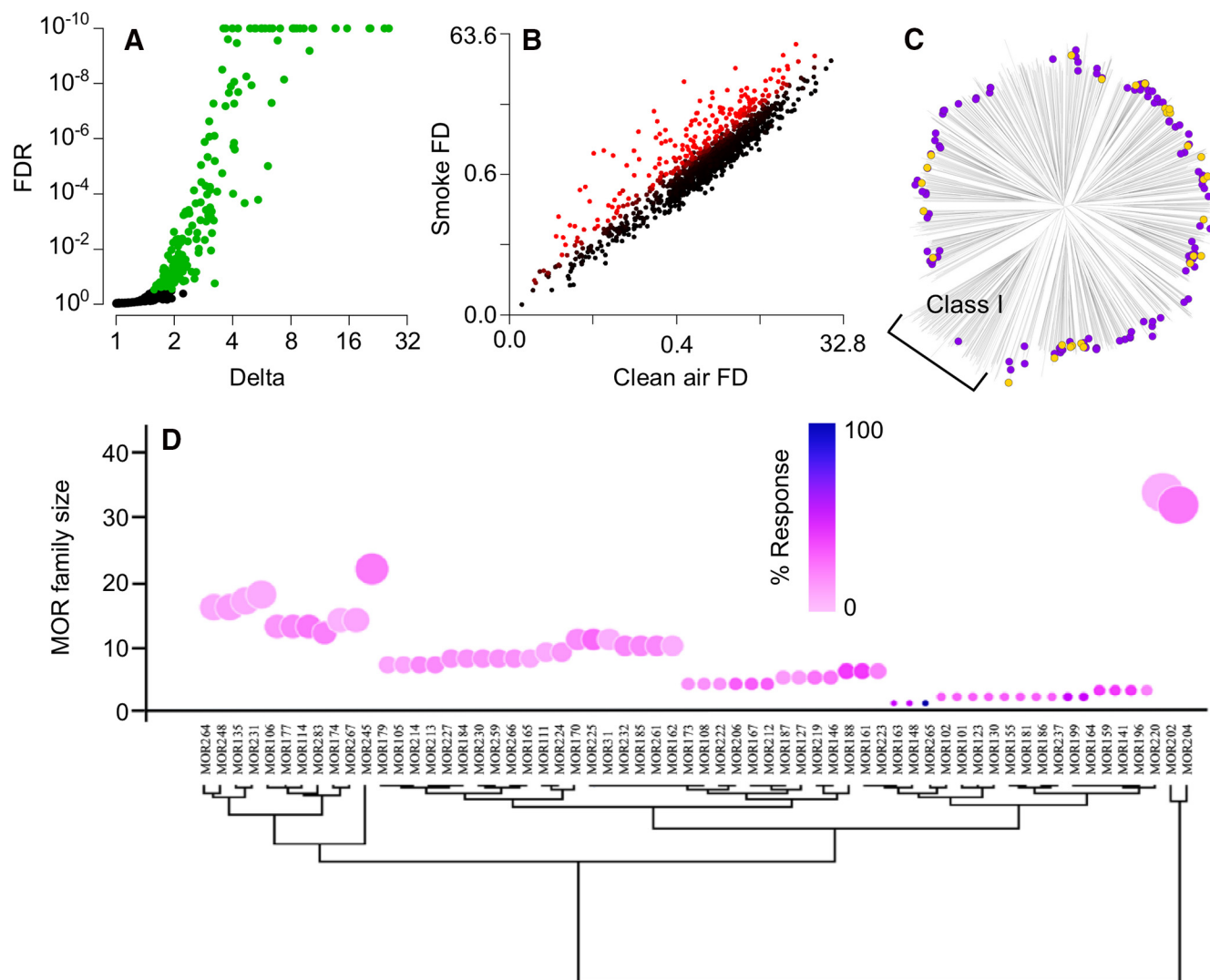
To compare receptor response patterns, we performed cluster analysis based on the following distance metric. To account for changes in overall magnitude of response, fold change differences on the log scale were quantile-normalized across experiments. A soft threshold was then applied so that only changes larger than twofold enrichment contributed to the distance. Euclidean distances between odor responses were then calculated. To assess whether odor responses were significantly similar, permutation tests were applied, forming a null distribution of odor distances by drawing 10,000 random permutations of the responses. This was done following the quantile normalization step, so that the distribution of responses was the same across all odorant response experiments. The permutation testing was implemented in R 4.0.2 ([www.R-project.org](http://www.R-project.org)).

## Results

### ORs and TAARs responsive to cigarette smoke

Cigarette smoke is highly complex, consisting of particulate matter, gases, and a wide variety of organic chemicals produced during the incomplete combustion of cigarettes (Rodgman and Perfetti, 2013). Among these are >400 structurally diverse volatile organic chemicals, known as odorants, making it one of the most complex odors known. Its complexity, which includes volatile amines, predicts that a broad array of ORs and TAARs would respond to it. To test this prediction, we used an *in vivo* assay that allows us to identify receptors responsive to any odor presented to freely behaving mice (McClintock et al., 2014). Expression of GFP from the S100a5 gene locus, which responds to odor-stimulated electrical activity in OSNs by rapidly increasing transcription (Fischl et al., 2014), marks responding OSNs. Because each OSN expresses only one OR or TAAR, capturing fluorescent and nonfluorescent OSNs by FACS followed by expression profiling to quantify all mRNAs allows us to measure in a single experiment every OR and TAAR. The mRNAs encoding responsive ORs show significant shifts from GFP<sup>-</sup> samples to GFP<sup>+</sup> samples in odor-stimulated mice compared with control mice stimulated with clean air, a fact confirmed by *in vitro* experiments (McClintock et al., 2014; de March et al., 2020).

Consistent with our predictions about large numbers of receptors responsive to complex odors, such as cigarette smoke, we detect responses from 144 ORs and 3 TAARs in freely behaving mice exposed to cigarette smoke (Fig. 1A; Table 2). These responses are specific to cigarette smoke and are not observed in mice exposed only to clean air (Fig. 1B). Sequence relationships divide ORs into two groups: terrestrial vertebrate-specific Class II ORs and the more evolutionarily ancient Class I ORs (Glusman et al., 2000). The ORs responsive to cigarette smoke are nearly all Class II ORs, with just one responsive Class I OR, Olfr619. The 143 Class II ORs responsive to cigarette smoke are widely distributed across the Class II portion of the OR sequence distance tree (Fig. 1C). This response pattern is robust, rich in breadth, and not concentrated around a few related or strongly responsive ORs (Fig. 1C). Instead, the response pattern consists



**Figure 1.** Receptors responsive to cigarette smoke *in vivo*. **A**, In mice, 144 ORs and 3 TAARs exceeded the FDR criterion for a significant response to cigarette smoke. Delta is the cigarette smoke response relative to the clean air control response. FDR values capped at  $10^{-10}$ . **B**, The distribution of responses, measured as the fold difference (FD) enrichment of receptor mRNAs in samples of active OSNs compared with inactive OSNs, identifies responses specific to cigarette smoke versus the clean air control (red). **C**, Responsive ORs are widely distributed across the Class I OR sequence distance tree. Only 1 Class I OR responses. Gold represents responses >5-fold. **D**, Clustering MOR families via similarity in family size and proportion of ORs responsive to cigarette smoke. No OR families contain large fractions of responsive ORs, and this fraction has little weight in the clustering of OR families. Only OR families containing responsive ORs are shown. Circle size reflects family size.

of numerous peaks of strongly responsive receptors that are widely divergent in sequence. For example, the receptors whose response magnitude is fivefold or more include all three TAARs and 28 ORs that belong to 21 different OR families. Of the 186 Class II OR families in mice (Zhang and Firestein, 2002), 66 of them contain at least one responsive OR. Thirty-seven OR families have multiple responsive ORs, and families MOR204, MOR245, MOR114, and MOR225 contain five or more responsive ORs. However, these four families are all large, and the responsive ORs do not account for even a simple majority of ORs within them (Fig. 1D). The only instance where nearly all members of a multiple OR family are responsive to cigarette smoke is the MOR265 family, but it contains only two ORs (Fig. 1D).

The responsive TAARs include two closely related sequences, Taar7d and Taar7f, and the more distantly related Taar2. The odorant agonists of these three TAARs are not well defined, but TAAR7f is known to respond to N-methylpiperidine and N,N-dimethylcyclohexylamine, whereas TAAR7d also responds to N,

N-dimethylcyclohexylamine (Liberles and Buck, 2006; Dewan et al., 2018). Of these two volatile amines, only N-methylpiperidine is known to be present in cigarette smoke (Rodgman and Perfetti, 2013). TAAR2 is one of several TAARs believed to be more responsive to primary amines, whereas the TAAR7 family may be more responsive to tertiary amines (Ferrero et al., 2012).

#### ORs highly sensitive to a mimic of cigarette smoke odor

Perception of the odor of cigarette smoke does not require all of the >400 odorants found in cigarette smoke. Odors resembling cigarette smoke odor have been produced using many fewer odorants (Dravnieks et al., 1975; Cortese et al., 2015b). An effective mimic reported by Dravnieks et al. (1975) contains 32 odorants known to occur in cigarette smoke or closely related in structure to an odorant found in cigarette smoke, with 26 core odorants and 6 odorants suspected of arising from chemicals or flavorings added to cigarettes. We formulated a mimic containing the 26 core odorants. The receptors highly sensitive to this

**Table 2. Receptors responsive to cigarette smoke**

OR	MOR name	Delta	OR	MOR name	Delta	OR	MOR name	Delta
Olfr488	MOR204-15	25.75	Olfr1257	MOR232-1	3.58	Olfr905	MOR167-1	2.29
Olfr1278	MOR245-11	24.46	Olfr1135	MOR177-2	3.53	Olfr1014	MOR213-5	2.28
Olfr1137 <sup>b</sup>	MOR177-20	20.69	Olfr1495	MOR266-9	3.53	Olfr433	MOR123-1	2.23
Olfr750	MOR103-18	20.43	Olfr52	MOR185-6	3.33	Olfr441	MOR261-3	2.23
Olfr736	MOR106-5	15.62	Olfr1123	MOR264-17	3.24	Olfr1204 <sup>d</sup>	MOR232-6	2.21
Olfr484	MOR204-16	13.62	Olfr1048	MOR187-2	3.22	Olfr1500	MOR212-4P	2.20
Taar2		13.57	Olfr1	MOR135-13	3.20	Olfr20	MOR135-11	2.20
Olfr1054	MOR188-2	10.42	Olfr437	MOR261-11	3.18	Olfr1111	MOR181-2	2.20
Olfr878	MOR163-1	10.28	Olfr1448	MOR202-5	3.13	Olfr491 <sup>b</sup>	MOR204-11	2.17
Olfr1277	MOR248-11	9.97	Olfr1026	MOR196-4	3.12	Olfr930	MOR171-46	2.16
Olfr153	MOR177-5	9.32	Olfr1044	MOR185-4	3.09	Olfr746	MOR106-12	2.16
Olfr894	MOR170-5	8.90	Olfr1131	MOR177-4	3.09	Olfr809	MOR108-4	2.16
Olfr1047	MOR188-3	8.57	Olfr352	MOR136-10	3.09	Olfr876	MOR161-1	2.14
Olfr1313	MOR245-23	8.36	Olfr976	MOR224-10	3.06	Olfr3	MOR136-14	2.13
Olfr16	MOR267-13	8.22	Olfr479	MOR267-15	3.06	Olfr870	MOR141-1	2.11
Olfr923	MOR164-2	8.16	Olfr958	MOR224-9	3.06	Olfr510	MOR204-34	2.11
Olfr1178	MOR225-6P	7.37	Olfr358	MOR159-4	3.03	Olfr619	MOR31-5	2.09
Olfr1496	MOR127-1	7.03	Olfr497	MOR204-9	3.03	Olfr900	MOR170-2	2.09
Olfr875	MOR161-4	6.83	Olfr922	MOR161-3	3.00	Olfr173	MOR184-3	2.08
Olfr360	MOR159-1	6.42	Olfr1198	MOR225-13	2.97	Olfr482	MOR204-14	2.06
Olfr1161	MOR174-2	6.35	Olfr1033	MOR199-2	2.95	Olfr1097	MOR206-2	2.05
Olfr1056	MOR186-2	6.20	Olfr860	MOR146-2	2.93	Olfr851	MOR155-1	2.05
Olfr769	MOR114-14	6.08	Olfr899	MOR170-8	2.91	Olfr1306	MOR245-15	2.04
Olfr247	MOR265-1	5.88	Olfr881	MOR162-7	2.90	Olfr509	MOR267-14	2.01
Olfr855	MOR148-1	5.66	Olfr506	MOR204-23	2.87	Olfr1396 <sup>b</sup>	MOR276-2	1.99
Taar7d		5.64	Olfr918	MOR164-3	2.87	Olfr486	MOR204-19	1.99
Olfr1032	MOR199-1	5.61	Olfr295	MOR220-1	2.76	Olfr481	MOR204-2	1.98
Olfr1182	MOR225-7P	5.41	Olfr1316	MOR245-1	2.75	Olfr1254	MOR231-13	1.98
Olfr1090	MOR188-4	5.26	Olfr1206 <sup>b</sup>	MOR230-3	2.74	Olfr908	MOR165-2	1.98
Taar7f		5.19	Olfr176 <sup>b</sup>	MOR184-8	2.73	Olfr1325	MOR102-1	1.98
Olfr1280 <sup>b</sup>	MOR248-1	5.00	Olfr1303	MOR245-7	2.68	Olfr1338	MOR259-9	1.97
Olfr777	MOR114-9	4.92	Olfr904	MOR167-3	2.67	Olfr1160	MOR173-1	1.97
Olfr490	MOR204-17	4.71	Olfr1331	MOR259-3P	2.63	Olfr1189 <sup>b</sup>	MOR237-2	1.96
Olfr160	MOR171-3	4.61	Olfr1034	MOR227-8P	2.60	Olfr145	MOR161-6	1.95
Olfr1045	MOR185-2	4.27	Olfr1308	MOR245-22	2.59	Olfr1202 <sup>d</sup>	MOR232-7	1.95
Olfr982	MOR223-4	4.26	Olfr1099	MOR206-3	2.58	Olfr980	MOR223-2	1.94
Olfr1087	MOR188-5	4.20	Olfr424	MOR105-2	2.54	Olfr1208	MOR225-4	1.93
Olfr1184	MOR225-3	4.10	Olfr1276	MOR245-10	2.53	Olfr1477	MOR202-10	1.92
Olfr699	MOR283-10P	4.07	Olfr1494	MOR266-1	2.48	Olfr794	MOR114-11	1.89
Olfr1489	MOR202-19	4.07	Olfr1030	MOR196-2	2.46	Olfr312	MOR222-4P	1.86
Olfr1122	MOR264-1	4.07	Olfr294	MOR219-5	2.39	Olfr780	MOR114-12	1.84
Olfr1140	MOR177-6	4.03	Olfr1243	MOR231-4	2.37	Olfr924	MOR171-47	1.80
Olfr467	MOR204-33P	4.02	Olfr1434	MOR214-4	2.37	Olfr935	MOR171-11	1.79
Olfr819	MOR265-2_p	3.99	Olfr738	MOR106-3	2.35	Olfr141	MOR179-5	1.78
Olfr706	MOR283-11	3.91	Olfr1201	MOR230-2	2.33	Olfr859	MOR146-3	1.77
Olfr1307	MOR245-19P	3.82	Olfr803	MOR111-3	2.33	Olfr705	MOR283-2	1.77
Olfr1366	MOR130-2	3.78	Olfr1281	MOR248-18	2.30	Olfr693	MOR283-8	1.76
Olfr1272	MOR227-3	3.68	Olfr771	MOR114-8	2.29	Olfr444	MOR261-2	1.76
Olfr521	MOR101-2	3.67	Olfr835	MOR219-5	2.29	Olfr470	MOR204-22	1.75

<sup>a</sup>Also responsive to artificial cigarette smoke odor and 1-pentanethiol.<sup>b</sup>Also responsive to 1-pentanethiol.<sup>c</sup>Also responsive to artificial cigarette smoke odor.

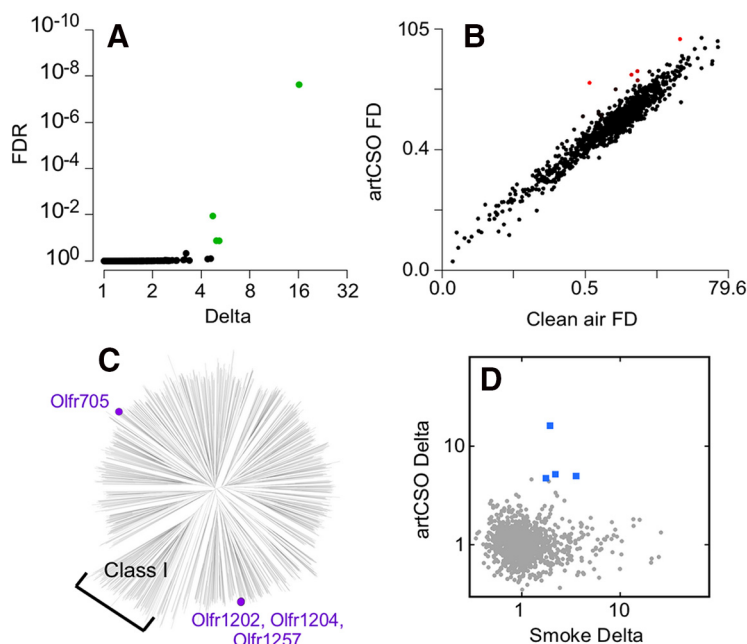
artificial cigarette smoke odor should represent receptors critical for forming a response pattern that is perceived by the brain as similar to the odor of cigarette smoke. Identifying these highly sensitive receptors would be complicated if some ORs have non-monotonic dose–response relationships with their odorant agonists, a phenomenon predicted by observations of olfactory bulb glomeruli dropping out of glomerular response patterns as odorant concentration increases and confirmed by measures of OR responses *in vivo* (Friedrich and Korsching, 1997; Rubin and Katz, 1999; Meister and Bonhoeffer, 2001; Wachowiak and Cohen, 2001; Fried et al., 2002; Bozza et al., 2004; Hu et al., 2020; McClintock et al., 2020). To ensure that we identified sensitive

ORs, we therefore tested artificial cigarette smoke odor under conditions where the odor concentration reaching the mice was substantially less than saturation. Under these conditions, four ORs gave significant responses (Fig. 2A). These responses were specific to artificial cigarette smoke odor and did not occur when the mice were exposed to clean air (Fig. 2B). Three of these ORs, Olfr1202, Olfr1204, and Olfr1257, belong to the MOR232 family, while Olfr705 belongs to the MOR283 family (Fig. 2C). These two OR families have 10 or more members, and both have multiple members responsive to real cigarette smoke, including all four ORs responsive to artificial cigarette smoke odor (Fig. 2D).

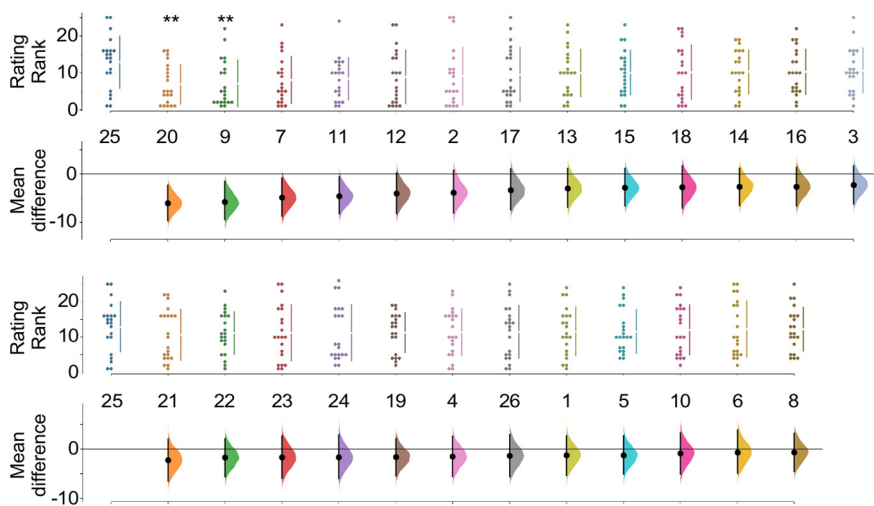
### 1-Pentanethiol is important for the perception of artificial cigarette smoke odor

To determine which odorants matter most to the artificial mimic of cigarette smoke odor, we asked human volunteers to rate the similarity of artificial cigarette smoke odor to 26 mixtures, each lacking one of the 26 odorants in the full mixture. Only two of these depletion mixtures prove to be perceived by human subjects as significantly different from the full mixture. Mixtures lacking 1-pentanethiol and 2-methoxyphenol are perceived as different from artificial cigarette smoke odor and from the depletion mixture most similar to artificial cigarette smoke odor (Fig. 3).

The importance of 1-pentanethiol and 2-methoxyphenol for the percept evoked by artificial cigarette smoke odor could arise via either of two very different mechanisms. The most straightforward mechanism is that these odorants evoke responses from ORs important to the cigarette smoke response pattern, and therefore by themselves evoke percepts resembling that of artificial cigarette smoke odor. Alternatively, many odorants are not only agonists at some ORs but are also antagonists at other ORs (Araneda et al., 2000; Spehr et al., 2003; Oka et al., 2004a,b; Sanz et al., 2005, 2008; Reisert, 2010), a phenomenon that is common *in vivo* (de March et al., 2020). Such antagonist effects could be critical for the perception of odor mixtures because of their ability to substantially alter the OR response pattern. To discriminate between these mechanisms, we asked human volunteers to rate the similarity and pleasantness of 14 individual odorants to artificial cigarette smoke odor. Odorants whose percepts resemble that of artificial cigarette smoke odor are unlikely to be important to the perception of cigarette smoke odor solely through receptor antagonism. The 14 odorants included 11 odorants present in the artificial cigarette smoke odor mixture, including the four odorants whose absence most affected perception of artificial cigarette smoke odor (1-pentanethiol, 2-methoxyphenol, 2-ethyl-3-methylpyrazine, and 5-methylfurfural) and seven odorants whose absence had little effect on the perception of artificial cigarette smoke odor (2,4-hexedienal, methyl isonicotinate, pyridine, 2-methylphenol, allylamine, indene, and diacetyl). Other odorants were included to act as outliers (acetophenone, DL-limonene, and 2-menthene). These experiments identify 1-pentanethiol, 2-ethyl-3-methylpyrazine, allylamine, and indene as having properties expected of an odorant acting as an important

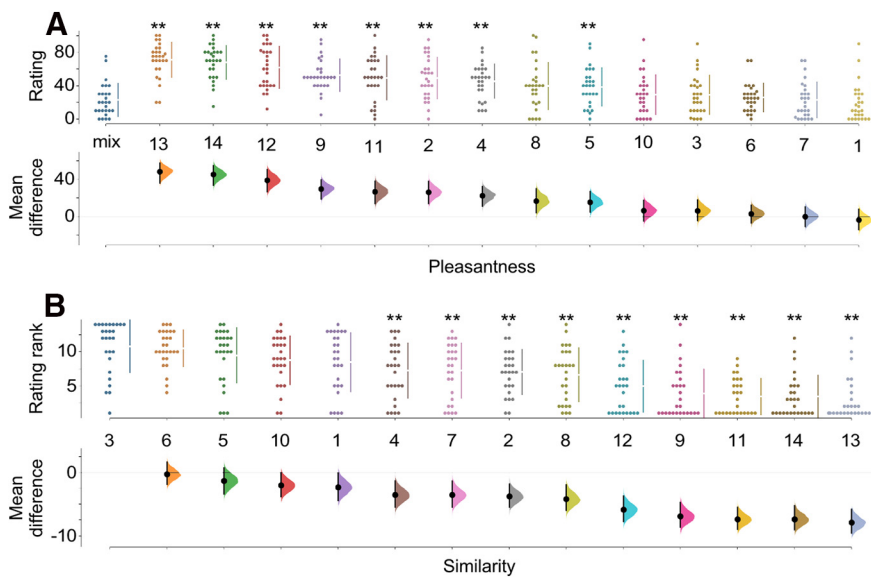


**Figure 2.** ORs responsive to artificial cigarette smoke *in vivo*. **A**, In mice exposed to a low concentration of artificial cigarette smoke odor (artCSO), only four receptors respond, and they are all ORs. Delta is the artificial cigarette smoke odor response relative to the clean air control response. **B**, The distribution of responses, measured as the fold difference (FD) enrichment of receptor mRNAs in samples of active OSNs compared with inactive OSNs, identifies responses specific to artificial cigarette smoke odor versus the clean air control (red). **C**, Of the responsive ORs, three are closely related to each other and not related to Olfr705, the other responsive OR. **D**, All four of the ORs responsive to a low concentration of artificial cigarette smoke odor (artCSO) also respond to cigarette smoke (blue squares).



**Figure 3.** 1-Pentanethiol and 2-methoxyphenol matter most. Subjects ( $n = 18$ ) rated 26 odor mixtures, each lacking one of the components of an artificial mimic of cigarette smoke odor, scoring the degree of similarity to the full mixture. The depleted mixture most similar to the full mixture lacks 2,4-hexedienal (#25), and only the mixtures lacking 1-pentanethiol (#20) and 2-methoxyphenol (#9) are significantly different from it. Odorants: 1, pyridine ( $t = 0.60$ ,  $p = 0.553$ ); 2, nicotinaldehyde ( $t = 1.65$ ,  $p = 0.101$ ); 3, 5-ethyl-2-methylpyridine ( $t = 1.10$ ,  $p = 0.278$ ); 4, 2-vinylpyridine ( $t = 0.72$ ,  $p = 0.474$ ); 5, 4-pyridinecarbonitrile ( $t = 0.63$ ,  $p = 0.532$ ); 6, methyl isonicotinate ( $t = 0.29$ ,  $p = 0.775$ ); 7, 2-ethyl-3-methylpyrazine ( $t = 2.34$ ,  $p = 0.024$ ); 8, 2-methoxy-3,5-methylpyrazine ( $t = 0.32$ ,  $p = 0.747$ ); 9, 2-methoxyphenol ( $t = 2.78$ ,  $p = 0.008$ ); 10, 2-methylphenol ( $t = 0.39$ ,  $p = 0.696$ ); 11, 5-methylfurfural ( $t = 2.28$ ,  $p = 0.028$ ); 12, 2,5-dimethylpyrrole ( $t = 1.81$ ,  $p = 0.078$ ); 13, phenylacetylene ( $t = 1.41$ ,  $p = 0.166$ ); 14, isoprene ( $t = 1.30$ ,  $p = 0.201$ ); 15, 1,3-cyclohexadiene ( $t = 1.38$ ,  $p = 0.174$ ); 16, indene ( $t = 1.28$ ,  $p = 0.207$ ); 17, allylbenzene ( $t = 1.50$ ,  $p = 0.142$ ); 18, diacetyl ( $t = 1.21$ ,  $p = 0.231$ ); 19, thiophene ( $t = 0.82$ ,  $p = 0.416$ ); 20, 1-pentanethiol ( $t = 3.09$ ,  $p = 0.004$ ); 21, allylamine ( $t = 1.01$ ,  $p = 0.316$ ); 22, 1-aminopentane ( $t = 0.85$ ,  $p = 0.402$ ); 23, butyric acid ( $t = 0.72$ ,  $p = 0.475$ ); 24, 1-hexanal ( $t = 0.72$ ,  $p = 0.477$ ); 25, 2,4-hexedienal; 26, indole ( $t = 0.62$ ,  $p = 0.541$ ). \*\* $p < 0.01$ .





**Figure 4.** Odorants similar to cigarette smoke include 1-pentanethiol. **A**, Subjects ( $n = 27$ ) rated the pleasantness of 14 monomolecular odorants, finding that only six of these odorants were not significantly different from artificial cigarette smoke odor (mix). **B**, Four of these six odorants also failed to be dissimilar from artificial cigarette smoke odor. Odorants: 1, 1-pentanethiol (pleasantness  $t = 0.61$ ,  $p = 0.538$ ; similarity  $t = 2.10$ ,  $p = 0.040$ ); 2, 2-methoxyphenol ( $t = -4.30$ ,  $p = 0.000$ ;  $t = 3.88$ ,  $p = 0.000$ ); 3, 2-ethyl-3-methylpyrazine ( $t = -1.07$ ,  $p = 0.291$ ); 4, 5-methylfurfural ( $t = -4.10$ ,  $p = 0.000$ ); 5, diacetyl ( $t = -2.68$ ,  $p = 0.009$ ;  $t = 1.25$ ,  $p = 0.218$ ); 6, allylamine ( $t = -0.61$ ,  $p = 0.542$ ;  $t = 0.33$ ,  $p = 0.744$ ); 7, pyridine ( $t = -0.01$ ,  $p = 0.990$ ;  $t = 3.33$ ,  $p = 0.0002$ ); 8, 2-methylphenol ( $t = -2.54$ ,  $p = 0.015$ ;  $t = 3.95$ ,  $p = 0.000$ ); 9, methyl isonicotinate ( $t = -5.59$ ,  $p = 0.000$ ;  $t = 6.86$ ,  $p = 0.000$ ); 10, indene ( $t = -1.08$ ,  $p = 0.287$ ;  $t = 2.02$ ,  $p = 0.048$ ); 11, 2,4-hexadienal ( $t = -4.21$ ,  $p = 0.000$ ;  $t = 8.24$ ,  $p = 0.000$ ); 12, acetophenone ( $t = -6.36$ ,  $p = 0.000$ ;  $t = 5.64$ ,  $p = 0.000$ ); 13, DL-limonene ( $t = -8.71$ ,  $p = 0.000$ ;  $t = 8.31$ ,  $p = 0.000$ ); 14, 2-menthene ( $t = -8.34$ ,  $p = 0.000$ ;  $t = 7.78$ ,  $p = 0.000$ ). \*\* $p < 0.01$ .

agonist in artificial cigarette smoke odor. They are not significantly different from artificial cigarette smoke odor in terms of perceived similarity or in terms of perceived pleasantness (Fig. 4). Overall, 1-pentanethiol is the only odorant whose absence has a significant effect on the perception of artificial cigarette smoke and also is perceived by itself as similar to cigarette smoke odor by humans.

### ORs responsive to 1-pentanethiol include ORs responsive to cigarette smoke

If 1-pentanethiol is truly important for the perception of cigarette odors, both real cigarette smoke and artificial mimics, we should find that several ORs responsive to it are among the ORs responsive to cigarette smoke. To test this hypothesis, we exposed freely behaving mice to headspace air above a solution of 25% 1-pentanethiol. This dilution exposes the mice to a relatively high, but not saturating, concentration of 1-pentanethiol and should result in responses from a substantial number of ORs. This prediction proved correct, with 58 ORs responding to 1-pentanethiol and not to the clean air control (Fig. 5A,B; Table 3). Of the 58 responsive ORs, 9 also respond to cigarette smoke: Olfr176, Olfr491, Olfr1137, Olfr1189, Olfr1202, Olfr1204, Olfr1206, Olfr1280, and Olfr1396. Of these, Olfr1137 is of particular interest because its response to cigarette smoke is the third largest we observed. In addition, both Olfr1202 and Olfr1204 also respond to artificial cigarette smoke odor.

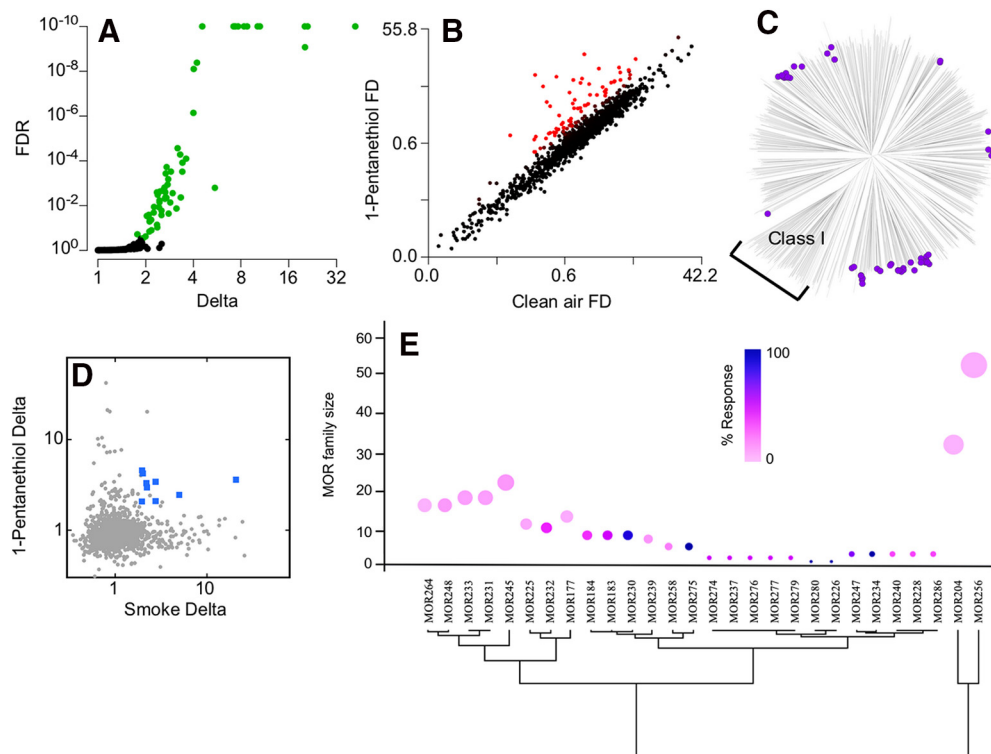
The ORs responsive to 1-pentanethiol are distributed in clusters across the OR sequence distance tree, with 28 OR families containing at least 1 responsive OR and 13 OR families containing multiple responsive ORs (Fig. 5D). This response pattern is less widely distributed than that of cigarette smoke, and in

certain OR families a large fraction of their ORs respond to 1-pentanethiol (Fig. 5E). In particular, a majority of ORs in families MOR230, MOR275, and MOR234 are responsive. This finding suggests that the ORs in these families might be particularly sensitive to thiols, or perhaps more broadly sensitive to short chain odorants.

Among the mouse ORs responsive to 1-pentanethiol are several that are common to receptor response patterns to odors that give rise to percepts related to cigarette smoke in humans. For example, the four ORs highly sensitive to artificial cigarette smoke odor are all part of the response pattern to real cigarette smoke and the response pattern to 1-pentanethiol contains 9 ORs responsive to real cigarette smoke. These overlaps in responsive ORs reflect a degree of similarity in the overall OR response patterns for artificial cigarette smoke odor, 1-pentanethiol, and real cigarette smoke. To assess the importance of these degrees of similarity, we compared response magnitudes measured for all ORs and TAARs in the *in vivo* assay for nine different odors: the three odors tested herein and six odors whose responses we published previously (Fig. 6). As expected, the patterns of response magnitude are significantly similar between 1-pentanethiol and artificial cigarette smoke odor, consistent with the finding that human subjects judge 1-pentanethiol to be the odorant component most important for perception of artificial cigarette smoke odor. Significantly similar pairs of response patterns also include the response patterns to concentrations of the same odor, a three-odorant mixture called a citrus accord, and the response patterns of two aldehydes, bourgeonal and undecanal. However, neither the 1-pentanethiol response pattern nor the artificial cigarette smoke odor response pattern is significantly similar to the response pattern to real cigarette smoke. These results suggest that the perception of two odors can in some cases be similar despite having large differences in OR response patterns.

### Discussion

The data obtained in this project, when interpreted in the context of our prior understanding of the initial encoding of odor signals, support five conclusions. (1) ORs responsive to 1-pentanethiol are important elements of the pattern of ORs responsive to cigarette smoke and related odors. In mice, support for this assertion is found in the ORs whose responses are shared across 1-pentanethiol, artificial cigarette smoke odor, and real cigarette smoke. In humans, support is found in the impact of removing 1-pentanethiol from artificial cigarette smoke odor and the similarity in perception between artificial cigarette smoke odor and 1-pentanethiol. (2) The cigarette smoke receptor response pattern is robust and broad. Even the 28 ORs most strongly responsive to it are widely divergent sequences distributed across 21 OR families. (3) The cigarette smoke OR response pattern is the first *in vivo* response pattern observed to include both ORs and TAARs, consistent with the presence of odorants containing amine groups among the >400 odorants found in cigarette smoke (Rodgman



**Figure 5.** ORs responsive to 1-pentanethiol *in vivo*. **A**, In mice, 58 ORs respond to headspace air above a solution of 25% 1-pentanethiol. Delta is the 1-pentanethiol response relative to the clean air control response. FDR values capped at  $10^{-10}$ . **B**, The distribution of responses, measured as the fold difference (FD) enrichment of receptor mRNAs in samples of active OSNs compared with inactive OSNs, identifies responses specific to 1-pentanethiol versus the clean air control. **C**, The responsive ORs are distributed in several clusters across the Class II portion of the OR sequence distance tree. **D**, Of the responsive ORs, nine are also responsive to cigarette smoke (blue squares). **E**, Clustering MOR families via similarity in family size and proportion of ORs responsive to 1-pentanethiol. Only a few OR families contain large fractions of responsive ORs. Only OR families containing responsive ORs are shown. Circle size reflects family size.

**Table 3. ORs responsive to 1-pentanethiol**

OR	MOR name	Delta	OR	MOR name	Delta	OR	MOR name	Delta
Olfr328	MOR275-2	41.90	Olfr1261	MOR234-3	3.34	<i>Olfr1280<sup>b</sup></i>	MOR248-1	2.46
Olfr195	MOR184-5	21.08	<i>Olfr491<sup>b</sup></i>	MOR204-11	3.31	Olfr1232	MOR233-18	2.44
Olfr224	MOR275-3	20.31	Olfr329-ps	MOR275-6P	3.19	Olfr1299	MOR248-8	2.44
Olfr1183	MOR230-6	20.25	Olfr124	MOR256-3	3.13	Olfr1256	MOR231-1	2.43
Olfr330	MOR275-1	10.52	<i>Olfr1204<sup>d</sup></i>	MOR232-6	2.97	Olfr1427	MOR239-4	2.38
Olfr1193	MOR226-1	10.19	Olfr31	MOR274-1	2.89	Olfr192	MOR183-x	2.37
Olfr1395	MOR277-1	8.76	Olfr1195	MOR230-4	2.86	Olfr331	MOR275-4	2.36
Olfr325	MOR275-5	8.38	Olfr48	MOR232-5	2.80	Olfr1262	MOR234-1	2.35
Olfr1279	MOR245-12	7.69	Olfr193	MOR183-7P	2.78	Olfr1260	MOR232-2	2.26
Olfr286	MOR286-2	7.39	Olfr183	MOR183-2	2.76	Olfr1209	MOR230-7	2.25
Olfr1284	MOR245-13	7.29	Olfr723	MOR247-4	2.71	Olfr1288	MOR245-9	2.17
Olfr1212	MOR233-17	7.19	Olfr165	MOR279-1	2.71	Olfr1321	MOR264-26	2.16
Olfr1394	MOR280-1	5.46	Olfr191	MOR183-5P	2.68	Olfr724	MOR247-2	2.12
<i>Olfr1189<sup>b</sup></i>	MOR237-2	4.55	Olfr1263	MOR234-2	2.66	<i>Olfr176<sup>b</sup></i>	MOR184-8	2.11
<i>Olfr1396<sup>b</sup></i>	MOR276-2	4.21	Olfr1342	MOR258-3	2.66	Olfr15	MOR256-17	2.11
Olfr175-ps1	MOR184-1	4.02	Olfr1359	MOR256-35	2.65	<i>Olfr1202<sup>d</sup></i>	MOR232-7	2.09
Olfr1186	MOR230-5	4.00	Olfr1265	MOR228-2	2.63	Olfr464	MOR240-2	2.08
<i>Olfr1137<sup>b</sup></i>	MOR177-20	3.60	Olfr1200	MOR225-12	2.63	Olfr1242	MOR231-5	2.03
<i>Olfr1206<sup>b</sup></i>	MOR230-3	3.42	Olfr476	MOR204-3	2.58			
Olfr1199	MOR230-8	3.41	Olfr1205	MOR230-1	2.52			

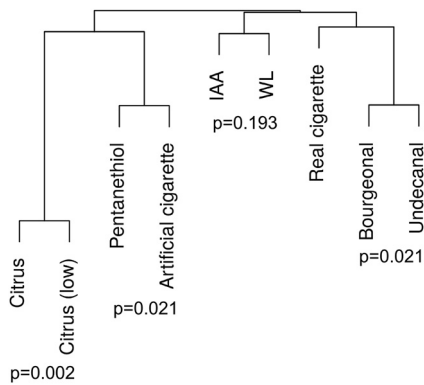
<sup>a</sup>Also responsive to cigarette smoke and artificial cigarette smoke odor.

<sup>b</sup>Also responsive to cigarette smoke.

and Perfetti, 2013). (4) Class I ORs are not important to the perception of cigarette smoke. Class II ORs constitute all but one of the ORs responsive to cigarette smoke and all of the ORs responsive to 1-pentanethiol and artificial cigarette smoke odor. (5) Our data provide the first example of odors evoking similar percepts while sharing ORs in their *in vivo* response patterns. This is

an anticipated result, but we are not confident this correlation will always prove true and urge caution before presuming that it does.

1-Pentanethiol is important to the perception of odors related to cigarette smoke, and ORs responsive to it are part of the OR response pattern to cigarette smoke and artificial cigarette smoke



**Figure 6.** Response pattern similarity. Cluster analysis displays relative similarity between *in vivo* receptor response patterns to nine odors tested in this study or published previously (de March et al., 2020; McClintock et al., 2020). Statistical analysis identifies three significantly similar response patterns, including that of 1-pentanethiol (Pentanethiol) and artificial cigarette smoke odor (Artificial cigarette). The receptor response pattern to cigarette smoke (Real cigarette) is not similar to any of the other response patterns. The citrus accord odors (Citrus), which are mixtures of three odorants, differ by 20-fold in the concentrations used as stimuli (5% vs 100%).

odor. Our human testing data confirm that 1-pentanethiol evokes a percept similar to artificial cigarette smoke odor; and correspondingly, the mouse OR response patterns between these two odors are more similar than chance. However, ORs responsive to 1-pentanethiol explain only a small part of the receptor response to real cigarette smoke, a portion insufficient to produce significant similarity between the overall response patterns of 1-pentanethiol and real cigarette smoke. Not surprisingly, 1-pentanethiol must be just one of several odorants important to the cigarette smoke response pattern. The identities of the others remain to be discovered.

The OR response pattern for 1-pentanethiol is also potentially indicative of ORs that respond to specific features of odorant molecules. This is especially true of families MOR230, MOR275, and MOR234 where a large fraction of the members of the family respond to 1-pentanethiol. Whether these groups of related ORs share sensitivity to certain simple thiols, or more broadly to many types of short chain odorants, pose interesting questions for future study. We do know that these are not the only families of ORs responsive to thiols. Olfr1509, a mouse OR responsive to a more complex thiol odorant, (methylthio)methanethiol (Duan et al., 2012), is not one of the ORs responsive to 1-pentanethiol, and other members of the same OR family (MOR244) also did not respond to 1-pentanethiol in our experiments.

Cigarette smoke is the first complex odor whose *in vivo* receptor response pattern has been measured. The breadth of the receptor response pattern evoked by cigarette smoke and the fact that the strongest responses are distributed across the diversity of Class II OR sequences and the TAARs are instructive. This is not simply because these complex odors contain so many species of odorants, although this is a contributing factor. The 1-pentanethiol OR response pattern by itself contains more than one-third of the number of receptors responsive to cigarette smoke and more than one-third of the number of OR families with members responsive to cigarette smoke. This breadth is consistent with previous findings that the response patterns of isoamyl acetate, bourgeonal, whiskey lactone, acetophenone, 2,5-dihydro-2,4,5-trimethylthiazoline, and carvones include ORs from several unrelated OR families (Hamana et al., 2003; Jiang et al., 2015; de March et al., 2020). We conclude that this breadth of responsivity is a characteristic feature of OR response patterns, not only for

complex odors but also for individual odorants. This conclusion is consistent with evidence that specific anosmias are relatively rare, even while hyposmias are fairly common and generally consist of reduced detection thresholds for certain odorants (Trimmer et al., 2019). Loss or mutation of the OR most sensitive to an odorant would lead to reduced sensitivity to the odorant, but not absence of detection, because other ORs less sensitive to the odorant will respond as concentration rises (Sato-Akuhara et al., 2016; Dewan et al., 2018). This understanding that most odorant responses consist of several unrelated ORs is also instructive about OR evolution. OR evolution must have been driven primarily by selective forces favoring expansion and diversification over forces selecting for ORs highly sensitive to, and specific for, individual odorants. This would allow OR evolution, and by extension the general olfaction function provided by the main olfactory epithelium, to keep pace with changing and expanding odor environments.

With >400 odorants, all thought to be capable of evoking responses from multiple receptors, why isn't the response to cigarette smoke even broader than what we observe? Some of this discrepancy is presumably because of some of the odorants in cigarette smoke being present at low concentrations incapable of producing responses detectable in the assay used. However, responses to mixtures of odorants have long been known to be less than the sum of the responses to the individual odorants in the mixture (Laing and Francis, 1989; Livermore and Laing, 1996; Poupon et al., 2018). Antagonism of ORs by odorants, which is very common in mixtures of odorants (de March et al., 2020), almost certainly also contributes. These odorant interactions at receptors result in response patterns that make discerning individual odorants in mixtures difficult and favor perceiving complex odors as distinct objects rather than a combination of the elements of the mixture (Thomas-Danguin et al., 2014). Cigarette smoke is certainly perceived as a distinct object rather than its component elements, and is one of the most common odors we humans encounter.

Odors that have similar percepts sufficient to belong to the same odor object categorization may do so because they share responses from some ORs. The OR responses shared between cigarette smoke, artificial cigarette smoke odor, and 1-pentanethiol support this hypothesis. Indeed, perceptual similarity is known to correlate with the degree of similarity in neural activity at multiple levels of the mammalian olfactory system, and this is expected to arise from similarity in OR response patterns (Wilson, 2009; Gottfried, 2010; Pashkovski et al., 2020). However, our evidence is not yet sufficient to have confidence that this hypothesis will prove correct for all cases of similar percepts, in part because our evidence is a correlation between human perception and mouse receptor physiology. In addition, we cannot rule out the possibility that cortical pattern completion processing mechanisms might sometimes find similarity between odors that do not have overlapping OR response patterns but instead have overlap at higher levels of olfactory signal processing. Furthermore, the inverse hypothesis of OR response pattern similarity necessarily resulting in perceptual similarity is almost certainly false. Instances of highly similar odorants that differ substantially in their percepts, although they evoke strongly overlapping patterns of activity in OSNs or olfactory bulb glomeruli, strongly predict that similar OR response patterns can give rise to distinct percepts (Linster et al., 2001; Hamana et al., 2003). A specific example revealed in our comparison of receptor response patterns is the similarity of mouse OR response patterns for bourgeonal and undecanal, which humans

perceive as being quite distinct. Our findings support the idea that OR response pattern similarity is a basis for perceptual similarity, perhaps even when response pattern similarity is just a small fraction of responsive receptors, but with the caveat that the CNS is also capable of producing distinct percepts even from significantly overlapping OR response patterns.

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