Screening the ToxCast Chemical Libraries for Binding to Transthyretin

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1 Abstract

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2 Transthyretin (TTR) is one of the serum binding proteins responsible for transport of thyroid hormones (TH) to target tissue and for maintaining the balance of available TH. Chemical 3 4 binding to TTR and subsequent displacement of TH has been identified as an endpoint in 5 screening chemicals for potential disruption of the thyroid system. To address the lack of data 6 regarding chemicals binding to TTR, we optimized an in vitro assay utilizing the fluorescent 7 probe 8-anilino-1-napthalenesulfonic acid (ANSA) and the human protein TTR to screen over 8 1,500 chemicals from the U.S. EPA's ToxCast ph1_v2, ph2, and e1k libraries utilizing a tiered 9 approach. Testing of a single high concentration (target 100 μ M) resulted in 888 chemicals with 20% or greater activity based on displacement of ANSA from TTR. Of these, 282 chemicals had 10 activity of 85% or greater and were further tested in 12-point concentration-response with 11 target concentrations ranging from 0.015-100μM. An EC50 was obtained for 276 of these 301 12 13 chemicals. To date, this is the largest set of chemicals screened for binding to TTR. Utilization of this assay is a significant contribution towards expanding the suite of in vitro assays used to 14 15 identify chemicals with the potential to disrupt thyroid hormone homeostasis. 16 Keywords: thyroid, screening, endocrine disruption, transthyretin, NAMs, in vitro 17 18 19 Abbreviations: TTR, transthyretin; NAMs, new approach methodologies; EDCs, endocrine disrupting compounds; TH, thyroid hormone 20 21

23 Introduction

24 Thousands of chemicals are developed each year adding to the thousands of chemicals 25 already in use (Naidu et al., 2021; van Dijk et al., 2021). It has been demonstrated that exposure to environmental contaminants can have adverse biological impacts; thus, it is necessary to 26 27 characterize the risks of these chemicals (Lazofsky & Buckley, 2022; Tijani et al., 2016). As the 28 number of chemicals grows each year, it becomes increasingly prohibitive to test them for effects in vivo. As such, regulatory agencies are turning to new approach methodologies 29 30 (NAMs), including in vitro high throughput screening, to assess a chemical's potential to interact at a specific molecular target and to identify endocrine disrupting chemicals (EDCs) (Mondou et 31 al., 2020; van der Zalm et al., 2022). The US Environmental Protection Agency's (US EPA) 32 33 Endocrine Disruptor Screening Program has focused on identifying EDCs that interfere with the estrogen, androgen, and thyroid systems (USEPA, 2022). Much work has been done in 34 35 validating in vitro assays to test chemical interactions at the estrogen and androgen receptors 36 to prevent reproductive impacts (Browne et al., 2015; Judson et al., 2015; Kleinstreuer et al., 2017); however, progress in developing new methods for targets within the hypothalamus-37 pituitary-thyroid (HPT) axis has been slower due to complexity of the thyroid system and 38 multiple targets for potential disruption (Noyes et al., 2019; USEPA, 2022). 39 The HPT axis is tightly regulated due to its importance in growth, development, and 40 41 metabolism (Boas et al., 2012; Nillni, 2010). There are several targets of potential interference along this HPT axis as well as in serum binding proteins and peripheral tissues (Boas et al., 2012; 42 Boas et al., 2006; Tan & Zoeller, 2007; Zoeller et al., 2007). Further, a feedback system signaling 43 when to turn on and off production of thyroid hormone (TH) is in place to maintain TH 44

45	homeostasis (Costa-e-Sousa & Hollenberg, 2012; Hoermann et al., 2015). The complexity of this
46	system requires development of in vitro assays for each of the targets to get a comprehensive
47	view of what may be occuring in vivo. To date, several in vitro assays have been developed and
48	used to screen chemicals for interference in processes related to hypothalamic and pituitary
49	signaling, thyroid hormone signaling, and thyroid hormone synthesis. Specifically, the thyroid-
50	relevant assays used to screen the ToxCast chemical libraries include thyroid hormone receptor
51	(Freitas et al., 2011; Knudsen et al., 2011; Martin et al., 2010; Romanov et al., 2008), thyroid
52	stimulating hormone receptor (Murk et al., 2013; Titus et al., 2008), thyrotropin releasing
53	hormone receptor (Knudsen et al., 2011), thyroid peroxidase (Paul Friedman et al., 2016; Paul
54	et al., 2014), sodium iodide symporter (Hallinger et al., 2017; J. Wang et al., 2018),
55	iodothyronine deiodinases (Hornung et al., 2018; Mayasich et al., 2021; Olker et al., 2019;
56	Renko et al., 2012; Renko et al., 2015), and iodotyrosine deiodinase (Olker et al., 2021; Renko et
57	al., 2016). An area not currently covered by these assays are the thyroid hormone distributor
58	proteins.
59	Transthyretin (TTR), also called prealbumin, is one of the serum binding proteins
60	responsible for delivering thyroid hormones to target tissues and maintaining the balance of
61	free versus bound TH (Rabah et al., 2019; Richardson, 2007; Schreiber, 2002). TTR is
62	synthesized in the liver and in the choroid plexus for TH transport in plasma and cerebral spinal
63	fluid (Magalhaes et al., 2021; Rabah et al., 2019). TTR is suggested to mediate delivery of TH
64	across the blood-brain barrier and through the placenta (Meerts et al., 2002). TTR is a
65	homotetramer with two TH binding sites; however, due to negative cooperativity it is
66	understood to bind only one TH at a time (Richardson, 2002; Tomar et al., 2012; H. Wang et al.,

2007). In addition to TH, TTR can bind retinol binding protein, which in turn binds and 67 transports retinol (Prapunpoj & Leelawatwattana, 2009). Chemical binding to TTR can displace 68 69 TH from the protein resulting in lack of TH delivered to the target tissue and subsequent 70 disruption of biological pathways dependent on TH activation (Cao et al., 2011). Competitive 71 binding with TTR in cerebrospinal fluid has been shown *in vitro* to increase free T4 which may negatively regulate production of TH (Radovic et al., 2006). Alternatively, TH freed from TTR 72 could be metabolized and excreted resulting in decreased TH levels in serum (Huang et al., 73 74 2023; Kim et al., 2018). Assays have been developed to assess chemical binding to TTR. These 75 include a radiolabeled ligand displacement assay (Lans et al., 1993) and the fluorescence-based competitive binding assays using fluorescein isothiocyanate-T4 conjugate (FITC-T4) or 8-anilino-76 77 1-naphthalenesulfonic acid ammonium salt (ANSA) (Cao et al., 2010; Montaño et al., 2012; Ren & Guo, 2012). The FITC and ANSA assays are currently being validated by the European Union 78 Reference Laboratory for Alternatives to Animal testing (EURL ECVAM, 79 tsar.jrc.ec.europa.eu/test-method/tm2019-08). 80 81 The objective of this work was to screen the ToxCast ph1 v2, ph2, and e1k libraries 82 (Richard et al., 2016) in the TTR-ANSA assay using a tiered approach to: 1) identify chemicals

- 83 with the potential to bind TTR, 2) determine an EC50 value for the chemicals that bind to TTR
- and displace ANSA based on 85% activity or greater in single concentration screening, and 3)
- 85 evaluate the performance of the assay for use in large-scale screening.
- 86 Materials and Methods
- 87 Overview

88	Development of this TTR binding assay for use in our lab was based on methods
89	developed by Montaño et al. (2012) to identify chemicals that bind to the protein by measuring
90	a reduction in fluorescence due to displacement of ANSA. The assay was optimized in a 96-well
91	plate with a fluorescence readout that measures displacement of the probe from the protein.
92	The assay used human TTR, 8-anilino-1-naphthalene sulfonic acid (ANSA) as the fluorescent
93	probe, dimethyl sulfoxide (DMSO) as the negative control, and L-thyroxine (T4) as the positive
94	control. TTR, ANSA, DMSO, and T4 were purchased from Sigma-Aldrich (St Louis, MO). The
95	screening format followed Hornung et al. (2018), Olker et al. (2019), Olker et al. (2021), and
96	Degitz et al. (2023) with initial screening at a single concentration (target of 100 μM) followed
97	by concentration-response testing for a subset of chemicals. Most chemicals screened in
98	concentration-response were tested from 0.015 to 100 μM but overall concentrations ranged
99	from 0.004 to 150 μM due to chemicals being plated in source plates at different
100	concentrations (details in "Chemicals" section).
101	Chemicals
102	1813 unique chemicals from the ToxCast libraries (Richard et al., 2016) were obtained
103	from Evotec (Branford, CT) via the ToxCast program. The set included chemicals from the
104	ph1_v2, ph2, and e1k libraries. The chemicals were supplied across twenty-five 96-well
105	chemical source plates with one chemical per well. Quality control of these chemicals relied on
106	requirements of the ToxCast library [e.g., identification, purity, analytical verification (Richard
107	et al., 2016)]. Chemical identities were masked until single concentration screening was
108	complete. Chemicals were provided at a target concentration of 20 mM in DMSO; however, for
109	some chemicals the plated concentration differed from the target concentration due to

solubility limitations in DMSO (120 chemicals <20 mM, 22 chemicals >20 mM). Further, the
concentration for 12 chemicals (oils and mixtures) was provided in mg/mL. Overall, 93.4% of
chemicals were provided within 1 mM of the target concentration.

In addition to test chemicals, DMSO, T4, and TTR were screened on each plate. DMSO, 113 114 the solvent control, served as a negative control due to its inability to displace ANSA from TTR. T4 is a known ligand of TTR and served as a positive control. The final amount of DMSO in the 115 DMSO and T4 controls was 0.5% to match the amount added in test chemical reactions. A 116 117 protein-only control was included to correct fluorescence values. Source plates were received with column 1 and several random wells left empty for addition of reference controls. A T4 118 standard curve was added in column 1 using a 10 mM stock solution prepared in 0.4 N NaOH 119 120 and diluted to final concentrations of 1.8, 0.81, 0.3645, 0.164, 0.0738, 0.0332. 0.0149, and 0.0067 µM. The maximum T4 concentration (1.8 µM) served as the positive control correlating 121 122 with complete displacement of ANSA from TTR. T4 concentrations were selected based on 123 assay optimization (see section below). Each replicate plate contained the T4 curve, additional high T4 and low T4 wells, DMSO, and TTR. Plate layouts for single concentration screening and 124 concentration-response testing are in Supplemental Figure 1. 125

126 *Autofluorescence*

Reduction in fluorescence is used to determine displacement of ANSA from TTR; thus,
autofluorescence of test chemicals is a potential interference of this assay. Specifically, one
concern would be that autofluorescence of the chemical would mask any reduction in ANSA
fluorescence resulting in a false negative response. To address interference, 1 μL of each
chemical was added to 199 μL of phosphate buffer, incubated for 2 hours at 4°C, and

132 fluorescence was measured using a BioTek Synergy Neo2 plate reader (Agilent, Santa Clara, CA)

133 with an excitation wavelength of 380 nm and an emission wavelength of 475 nm.

134 Binding assay optimization

Several iterations of the binding assay were performed while optimizing this assay for 135 136 use in our lab. Initial testing followed the parameters outlined by Montaño et al. (2012) with 137 reactions containing 0.5 μ M TTR, 0.6 μ M ANSA, and a T4 curve ranging from 100-1000 nM. Additionally, we assessed the difference in using clear vs black 96-well plates and flat vs round 138 139 bottom plates in an effort to minimize background fluorescence. Black round-bottom plates 140 (Corning 3356) were selected for use as assay plates. Further optimization included testing 141 different concentrations and ratios of TTR and ANSA with the goal of reducing the amount of 142 TTR in each reaction to ultimately lower the cost of the assay.

143 Assay conditions

144 Each 200 μ L reaction contained 0.125 μ M TTR, 1.2 μ M ANSA, and 0.5% DMSO in 0.1 M 145 phosphate buffer, pH 7.5. Four individual master mixes were prepared: a main master mix for test chemicals which contained all components except DMSO, the T4 and DMSO master mixes 146 147 which contained all components, and a TTR master mix which did not contain ANSA 148 (Supplemental Table 1). Master mixes were prepared in low light to prevent ANSA degredation. 149 Each master mix was loaded into the appropriate wells of a 2 mL 96-well reservoir plate. Using 150 a Biomek i5 liquid handler (Beckman Coulter, Indianapolis, IN), six 96-well black assay plates 151 were loaded with master mix. Subsequently, 2 μ L T4 and 1 μ L test chemical were added to the 152 assay plates using a 20 µL Rainin Liquidator 96-channel benchtop pipettor (Mettler Toledo, 153 Columbus, OH). Reactions were mixed by pipetting using a 200 µL Rainin Liquidator, sealed

with a polyolefin plate seal, and shaken on a Jitterbug microplate shaker (Boekel Scientific,
Feasterville, PA) for 2 minutes at 1000 rpm. Assay plates were covered with foil and incubated
at 4°C for 2 hours. Following incubation, fluorescence was measured using a BioTek Synergy
Neo2 plate reader (Agilent, Santa Clara, CA) using an excitation wavelength of 380 nm and an
emission wavelength of 475 nm.

159 Chemical screening

Chemical screening was performed using a tiered approach. The first tier was comprised 160 161 of screening each chemical at a single concentration. The target concentration for single 162 concentration screening was 100 μ M with some variation based on solubility. Daughter plates 163 were thawed before use and were used to load three individual assay plates (n=3 for each 164 chemical, one well on each assay plate; see Supplemental figure 1A for plate layout). Additionally, a "T4 source plate" was prepared. The T4 source plate contained an adequate 165 166 volume of each concentration of the T4 standard curve and the additional high and low T4 167 concentration wells. The T4 source plate was used to load individual assay plates using the Liquidator as described previously. Data were normalized to percent of control with the low 168 169 concentration of T4 representing maximum fluorescence (no displacement of ANSA) and the highest concentration of T4 representing no fluorescence (100% ANSA displaced). In single 170 171 concentration screening, chemicals were considered inactive if they displayed less than 20% 172 activity compared to the high T4 concentration control.

A subset of chemicals with the greatest activity moved forward to concentrationresponse testing. Specifically, the 282 chemicals with 85% or greater median displacement of ANSA were tested in 12-point concentration-response curves in an effort to establish EC50s for 176 these chemicals binding to TTR thereby displacing ANSA. The 85% activity level for moving 177 chemicals forward for concentration-response testing differed from previous thyroid screening 178 assays (e.q., deiodinases used a 50% activity threshold). In this assay, a large proportion of 179 chemicals showed activity >50%; thus, selecting 85% activity as the threshold for moving 180 chemicals onto concentration-response testing provided better discrimination from a 181 prioritization standpoint. For concentration-response testing, chemicals were taken from the original chemical source plate and aliquoted in a new 96-well polypropylene plate ("CR source 182 183 plate") to prepare dilutions in DMSO. Chemicals were tested in 12-point curves with target 184 concentrations of 0.015, 0.034, 0.076, 0.168, 0.374, 0.83, 1.845, 4.101, 9.113, 20.25, 45, and 100 μ M, one chemical per row with different concentrations in each column tested in three 185 186 separate assay plates (n=3 for each chemical at each concentration, see Supplemental Figure 1B for plate layout). 187

188 Data Processing and Analysis

Data were processed and analyzed in R [version 4.2.1, (R Core Team, 2022)] using an 189 automated pipeline that normalized data, calculated plate diagnostics, and assigned assay-190 191 specific flags. Data were processed by: 1) adjusting relative fluorescence units (RFUs) by 192 subtracting fluorescence in the TTR-only wells, and 2) normalizing test chemical responses to 193 the concentration-response curve of the model chemical T4 fit to the Hill model with high 194 concentration T4 (1.8 μM) representing 100% of ANSA displacement (0% of control) and low T4 (0.0067 µM) representing 0% ANSA displacement (100% of control). Results are reported as 195 196 percent activity which was calculated as 100 minus the percent of control. Results for single

197 concentration screening are reported as percent activity calculated from the median of the198 three replicates with range used to display variability.

199 Concentration-response data were analyzed using the ToxCast Analysis Pipeline (tcpl) package version 3.0.1 (Filer, 2022) using the tcplLite option. In this analysis, percent activity was 200 201 used as the response value and 20% activity as the threshold cutoff. This 20% cutoff was 202 selected to have a consistent threshold across assays. The three replicates for each concentration of a chemical were included to fit dose-response curves based on the constant, 203 constrained Hill, and constrained gain-loss model. The best model fit was identified based on 204 205 the lowest Akaike Information Criterion (AIC) value. For chemicals that fit the Hill or gain-loss model, the EC20, EC50, and Hill slope were calculated from the model fit parameters. Results 206 207 from concentration-response screening are displayed as displacement from the maximum response with chemical concentration (log10 scale) on the x-axis and percent of control on the 208 209 y-axis.

210 Assay quality

211 Quality control measures were calculated following methods previously described 212 (Olker et al., 2019; Olker et al., 2021). Briefly, variability and separation between the positive 213 control (1.8 µM T4) and solvent/negative control (DMSO) were evaluated with plate-wise Z' 214 factors. The Z' factor is an indicator of assay quality, and values above 0.5 indicate good 215 separation between positive and negative controls (Zhang et al., 1999). A Z' factor greater than 216 or equal to 0.5 was used as a guideline for acceptable plate runs. Typically assay plates were 217 rerun to replace data from plate runs where quality criteria were not met (*e.g.*, low Z' factor,

poor control data). In one instance, a Z' factor less than 0.5 was not re-run because the two
other replicates for that plate met the quality criteria.

Data that fell outside of acceptable parameters for variability and fluorescence were flagged for manual review. Flags included high variability when the absolute difference between the mean and median of three replicate runs was greater than 10% and potential assay interference indicated by fluorescence outside of normal ranges. Individual wells with observed problems (*e.g.*, outliers, low volume in a well in one replicate) were excluded from analyses with only two replicates used.

226 Results

227 Assay Optimization, Performance, Quality Control

228 Optimization of the TTR binding assay in our lab resulted in a fluorescence-based assay suitable for screening large chemical libraries for binding to the human TTR protein. To 229 230 evaluate data quality, standard curves, Z' factor, and variability of the controls were evaluated 231 for each assay plate and summarized across all plates. Quality control metrics were consistent 232 over the duration of data collection in triplicate testing of 25 single concentration plates and 52 233 concentration-response plates. Standard curves for the positive control (T4) were consistent with mean EC50 of 0.075 ± 0.02 SD and mean Hill slope of -1.113 ± 0.29 SD. Standard curves for 234 235 all replicates had a Z' factor >0.5 except for one plate which failed acceptance criteria with a Z' 236 factor of 0.302. The low Z' factor in this plate was attributable to unusually low fluorescence in 237 a DMSO control well; however, the two other replicate plates had Z' factors >0.5, and this set of 238 plates was a repeat run with data similar to the initial assay run. Additionally, the mean Z'

factor across all plates was 0.883± 0.06 SD and ranged from 0.542 to 0.98 when the one
replicate plate was excluded.

241 Autofluorescence

242 The assessment of chemical autofluorescence was done after screening all chemicals in 243 the TTR assay to better understand an allowable threshold for chemical autofluorescence. For 244 this analysis, the threshold for allowable chemical autofluorescence was set at 10% of maximum reaction fluorescence (i.e., 10% of the average DMSO negative control fluorescence 245 246 across all single concentration and concentration-response plates). The average maximum fluorescence in DMSO wells across all plates was 10263, so the threshold for chemical 247 autofluorescence was 1026.3. Based on this threshold, 262 chemicals were determined to be 248 249 autofluorescent (Figure 1). The 262 chemicals interfering with the assay are listed in Supplemental Table S2. Additionally, 39 chemicals (Supplemental Table S3) were flagged during 250 251 data processing due to fluorescence being more than 20% greater than DMSO negative controls 252 (*i.e.*, RFUs > DMSO+20%). Due to these exclusions, results from 1512 of the 1813 chemicals are reported herein. 253

254 Single Concentration Screening

255 Data from single concentration screening are being used in the Tox24 challenge for 256 independent researchers to develop methods to predict compounds' ability to bind TTR using 257 only chemical structure data (https://ochem.eu/static/challenge.do) (Tetko, 2024). Thus, results 258 from the blind and leaderboard sets are not included in this version of the manuscript but will 259 be made publicly available at the conclusion of the challenge. In single concentration screening, 260 624 chemicals had <20% activity compared to the activity of high concentration T4 controls and

261	were considered inactive (Table 1, Figure 2). Of the 888 chemicals with activity of 20% or
262	greater, 282 had 85% or greater activity and were moved onto concentration-response testing
263	(Supplemental Table S4).

264 Concentration-response Testing

265 Results from concentration-response testing confirmed single concentration screening results for 96% of the 282 chemicals tested. Results were considered consistent when the 266 percent difference between median percent activity in single concentration screening and 267 268 median percent activity at the maximum concentration tested in concentration-response was 269 less than 25%. Two of the chemicals, X and tripropylene glycol monomethyl ether, were active in single concentration screening and had less than 20% activity at the highest concentration 270 271 tested in concentration-response. Different sets of source plates were used for single concentration and concentration-response testing; thus, it is possible that there was an error in 272 273 dosing in either of the assays. The remaining nine chemicals that were inconsistent ranged from 274 86-102% activity in single concentration screening and 32-73% activity at the maximum 275 concentration tested in concentration-response. The Hill model was identified in the ToxCast pipeline as the best fit model for 230 of 282 276 chemicals, and the gain-loss model was the best fit model for 50 chemicals. EC50 values were 277 278 obtained for 276 of the chemicals screened in concentration-response (Supplemental Table 5, 279 Supplemental Figure 2). For the 6 chemicals with no EC50 reported, two were inactive at all concentrations tested (X and tripropylene glycol monomethyl ether) and the constant model 280 was the winning fit. The other four chemicals (citronellol, X, 281

1,3,5,7-Tetramethyl-1,3,5,7-tetravinylcyclotetrasiloxane, and difenzoquat) did not reach 50%
activity at the highest concentration tested in concentration-response.

The 25 most potent chemicals, ranked by EC50, are listed in Table 2. Twenty-four of the 284 chemicals had EC50 values less than or equal to the mean EC50 of T4 indicating that these 285 286 chemicals are equally or more potent as T4 in binding to TTR. Example curves for selected chemicals are displayed in Figure 2. Complete displacement of ANSA from TTR was not achieved 287 for the nine chemicals presented from the top twenty-five ranked inhibitors. These chemicals 288 were more (Figures 2B-2I) or equally (C.I. disperse Black 6 dihydrochloride, Figure 2J) potent 289 290 compared to T4 based on EC50. These chemicals could have been tested at even lower concentrations to achieve 100% of control (zero activity) and establish a full concentration-291 292 response curve.

293 Discussion

294 Investigating chemical binding to TTR is important due to TTR's role in transporting 295 thyroid hormone to target tissues as well as maintaining thyroid hormone homeostasis. It is 296 commonly understood that displacement of T4 from TTR results in enhanced clearance and 297 reduced serum TH concentrations (Brouwer et al., 1989; Morse et al., 1996; Yamauchi et al., 298 2003). While some research has been done to investigate chemical binding to serum transport 299 proteins, this study presents the largest library of chemicals screened to date. Screening 1512 300 chemicals from the ToxCast chemical library through the TTR-ANSA binding assay presented herein resulted in identification of 888 active chemicals (20% activity or greater). Of these, 282 301 302 produced 85% activity or greater including 243 chemicals that, to our knowledge, have not 303 previously been shown to bind TTR.

The data set was evaluated to determine whether any functional groups are enriched in 304 305 the highly active (>85% activity) chemicals compared to the less active chemicals screened in this assay (Sushko et al., 2011; Vorberg & Tetko, 2014). SMILES were downloaded from the 306 CompTox Chemicals Dashboard for the ph1 v2, ph2, and e1k library lists. Following the 307 308 approach of Vorberg and Tetko (2014), SMILES were uploaded into the Online Chemical 309 Modeling Environment (OCHEM). SMILES were recognized for 1504 individual chemicals. The chemicals were discretized by setting 85% activity as the threshold. There were 280 chemicals 310 311 recognized as having "high" activity (>85%), and the remaining chemicals were categorized as 312 "low" activity. The SetCompare Utility was then used to compare functional groups enriched among the highly active chemicals (Table 4). This analysis revealed that azo compounds and 313 314 phenols are overrepresented in the highly active compounds with enrichment factors of 68 and 6.6, respectively. Interestingly, hydroxy compounds containing alcohols or phenols were 315 316 grouped together and found to be enriched among the highly active compounds; however, this 317 is largely due to enrichment of phenols (36.2% of high-actives vs 5.5% of low actives) since alcohols are enriched in the low-active group (enrichment factor 4.8). The top 25 most active 318 chemicals (Table 2) were assessed for the presence of enriched functional groups. Most of the 319 25 most potent chemicals screened in this TTR assay are arenes, which were enriched by a 320 321 factor of 1.7 in highly active chemicals, and many of them are phenols. Further, thirteen of the 322 chemicals are halogen derivatives, which had an enrichment factor of 1.6. Three azo compounds are present among the list of 25 most potent TTR binders. 323 324 Further investigation was done for the 25 most potent chemicals in this assay (lowest EC50s) to determine whether they have demonstrated thyroid activity in other in vitro or in vivo 325

assays. Specifically, in vitro activity was assessed in thyroid assays with data available through 326 327 the US EPA's CompTox Chemicals Dashboard (USEPA, 2021). The majority of the top 25 potent chemicals are active in multiple thyroid relevant assays. All of the chemicals except for 2,4,6-328 trichlorophenol were active in at least one other in vitro assay. Three chemicals (bromoxynil, 329 330 chlorthal-dimethyl, and ammonium perfluorooctanoate) were active in only one other in vitro assay, which was the Tox21 TR Luc GH3 antagonist assay. Twenty-three of the twenty-five 331 chemicals were active in the Tox21 TR Luc GH3 antagonist assay; however, eighteen of them 332 333 were also active in the associated viability assay indicating potential cytotoxicity. It has been 334 reported that the Tox21 TR Luc GH3 antagonist assay is sensitive and identifies chemicals as active even if they are not direct thyroid receptor antagonists (Paul-Friedman et al., 2019). 335 336 Chemical activity in the TTR binding assay and in other assays in which TH is the substrate (iodothyronine deiodinases) or ligand (thyroid receptor) makes sense due to TH being 337 338 endogenous ligands for TTR. However, several chemicals are also active in the thyroid peroxidase (stimulated by thyroid-stimulating hormone) and iodotyrosine deiodinase (recycles 339 iodide from mono- and diiodotyrosine) assays which are not regulated by TH, suggesting that 340 these chemicals have non-specific interactions with multiple targets in the thyroid axis. To 341 further clarify thyroid activity of these chemicals, a basic review of the literature was performed 342 to identify in vivo thyroid activity. The review was performed by searching "(thyroid OR T4) AND 343 344 (chemical name)" in Web of Science (search conducted July 24, 2023). As anticipated, there are many reports of in vivo thyroid activity for the thyroid hormone analogs Tetrac (ranked 1) and 345 Triac (ranked 4). No *in vivo* studies were found for eighteen of the chemicals. Thyroid activity 346 347 was demonstrated in vivo for the remaining five chemicals: ammonium perfluorooctanoate

348 (Butenhoff et al., 2012), 2,4,6-tribromophenol (Fu et al., 2020; Lee et al., 2016),

diethylstilbestrol (Lin et al., 2023), apigenin (Panda & Kar, 2007), and dinoseb (Van den Berg et
al., 1991).

The EC50 values generated in this study were compared with those from previous 351 352 screening efforts using radiolabeled ligand (¹²⁵I-T4) as well as fluorescein isothiocyanate (FITC-T4) and 8-anilino-1-napthalene sulfonic acid (ANSA) assays (Table 4). There was a total of thirty-353 six chemicals overlapping between previous TTR screening assays and the ToxCast libraries. 354 355 There are some chemicals (e.g., amiodarone, benzoic acid, methimazole) with reported EC50s 356 from previous ANSA screening assays greater than 24 μM which was corroborated by the ANSA assay reported herein by low percent activity in single concentration screening which precluded 357 358 the chemicals from being screened in concentration-response. Similarly, several chemicals 359 screened in the ¹²⁵I-T4 assay had indeterminable EC50 values (2-perfluorohexyl ethanol, 360 bisphenol A diglycidyl ether, hexanoic acid, and octanoic acid) which were not screened in concentration-response in this study due to low activity in single concentration screening. 361 Interestingly, bisphenol A had 96% activity in single concentration screening but a relatively 362 high EC50 value of 8.63 µM. The EC50 for bisphenol A was not determined in a previous ¹²⁵I-T4 363 assay suggesting this chemical does not have a particularly high affinity for TTR which agrees 364 365 with the higher EC50 value determined in this study. In general, the ANSA-TTR assay conditions 366 in this study appear to be more sensitive than other TTR binding assays with amiodarone in the FITC assay as the only exception. It has been reported that TTR is sensitive to changes in assay 367 conditions (Chauhan et al., 2000; Marchesini et al., 2006); thus, the variety of methods and 368 369 assay protocols used to investigate chemical binding to TTR hinder quantitative comparisons

370 (Marchesini et al., 2006). However, the T4 EC50 values reported in this study are in the range of
371 those reported in literature (Table 3).

There are costs and benefits to each of the three screening methods previously used. 372 The radio-labeled method uses the endogenous ligand of TTR to assess competition of 373 374 chemicals for binding to the protein; however, the radiolabeled substrate can be expensive and hazardous, and the assay is not easy to adapt to a medium or high throughput format. ANSA is 375 376 relatively inexpensive and non-toxic, but it is known to bind to many proteins by nonselective 377 hydrophobic forces and cannot be used to specifically explore ligand binding sites (Ren & Guo, 378 2012). FITC may be more sensitive than ANSA due to the fluorescent probe being conjugated to the endogenous ligand; however, the FITC assay may be less sensitive than the radiolabeled 379 380 ligand binding assay due to steric hindrance of the FITC moiety reducing the binding affinity of the probe (Ouyang et al., 2017). 381

382 Based on assay performance metrics and the high Z' factors over the duration of 383 screening, this ANSA fluorescence-based assay is suitable for high throughput screening of chemicals for binding to TTR; however, the large percentage (58.7%) of active chemicals may 384 indicate that the assay may not be sufficiently specific for use in risk assessment. It is also 385 possible that the TTR homotetrameric structure is not maintained in vitro and the reduction in 386 fluorescence for the presumably active chemicals may be a result of protein degradation as 387 388 opposed to chemical binding; however, this was previously tested in our lab with several perand polyfluoroakyl substances and degradation of the protein structure was not observed. This 389 390 supports the need for development of orthogonal high-throughput screening assays to confirm these chemicals are truly active. Overall, results from this assay, especially in conjunction with 391

393	testing.
394	Disclaimer
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additional thyroid relevant assays, may be used to identify chemicals to prioritize for higher tier

414 Tables

Table 1. Summary of single point screening at an initial target concentration of 100 μ M: percent and number of chemicals in each library that produced less than 20% or greater than/equal to 20%, 50%, and 85% activity. **Actual % and # withheld until the end of the Tox24 Challenge*

	# chemicals	% with < 20%	% with ≥ 20%	% with ≥ 50%	% with ≥ 85%
Chemical library	tested ^a	activity (#)	activity (#)	activity (#)	activity (#)
ToxCast ph1_v2	262	% (#)	% (#)	% (#)	% (#)
ToxCast ph2	578	% (#)	% (#)	% (#)	% (#)
ToxCast e1k	672	% (#)	% (#)	% (#)	% (#)
Total	1512	% (#)	% (#)	% (#)	% (#)

420	Chemical names, CAS registry numbers, maximum tested concentrations, and median % activity produced can be
421	found in Supplementary Table S3.
422	

423 ^aChemical plates received from ToxCast included 1813 unique chemicals; however, 301 compounds had evidence
 424 of interfering with the TTR assay and were excluded from all summaries and analyses.

439 **Table 2.** The top 25 ranked chemicals for binding to transthyretin (TTR) based on EC50.

440 *Chemicals from the blind and leaderboard sets withheld until the end of the Tox24 challenge.

			Max Tested	% Activity at		
Rank	Chemical	CASRN	Conc., μM	Max Conc. ^a	EC20 (μM)	EC50 (µM)
1	Tetrac	67-30-1	100	107.7	0.011	0.017
2	o-Aminoazotoluene	97-56-3	100	109.4	0.007	0.018
3	4,6-Dinitro-o-cresol	534-52-1	100	109.5	0.004	0.020
4	Tiratricol	51-24-1	100	104.7	0.008	0.021
5	Bromoxynil	1689-84-5	80	103.5	0.007	0.022
6	3,3',5,5'-Tetrabromobisphenol A	79-94-7	100	107.2	0.015	0.024
7	Diethylstilbestrol	56-53-1	100	104.3	0.011	0.025
8	2,4,6-Tribromophenol	118-79-6	100	106.3	0.014	0.028
9	Acid Red 337	67786-14-5	100	107.0	0.013	0.033
10	2,2',6,6'-Tetrachlorobisphenol A	79-95-8	100	106.9	0.012	0.033
11	2-Chloro-4-phenylphenol	92-04-6	100	106.1	0.015	0.034
10	4-Bromo-2-(4-chlorophenyl)-1-(ethoxymethyl)-	122453-73-0				
12	5-(trifluoromethyl)-1H-pyrrole-3-carbonitrile		100	103.1	0.017	0.035
13	Apigenin	520-36-5	100	104.4	0.012	0.035
14	Dinocap	39300-45-3	100	112.0	0.012	0.036
15	2,4,6-Trichlorophenol	88-06-2	100	103.9	0.011	0.042
16						
17	2,4-Dihydroxybenzophenone	131-56-6	100	105.5	0.010	0.045
18	Phenolphthalein	77-09-8	100	104.5	0.007	0.049
19	Chlorthal-dimethyl	1861-32-1	100	103.2	0.012	0.055
20	Chrysin	480-40-0	100	105.3	0.013	0.055
21	Fluazinam	79622-59-6	100	109.8	0.016	0.062
22						
	L-thyroxine (T4, positive control)	51-48-9	1.8			0.075 ±0.02
23	Ammonium perfluorooctanoate	3825-26-1	100	103.8	0.011	0.075
24	C.I. Disperse Black 6 dihydrochloride	20325-40-0	100	111.4	0.018	0.080

	25	Dinoseb	88-85-7	50	110.6	0.19	0.081
441	^a Media	n of three replicates at maximum conc	entration of chemical in concentration	on-response tes	ting.		
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Table 3. Analysis of functional groups enriched in high and low TTR binding activity groups using

458 the SetCompare Utility of OCHEM.

	High	h activity Low activity		Enrichment		
Descriptor	#	%	#	%	factor	p value
Phenols	101	36.2	66	5.5	6.6	3.86E-38
Arenes	217	77.8	555	46	1.7	8.27E-23
Aromatic compounds	225	80.6	624	51.7	1.6	6.05E-20
Azo	19	6.8	1	0.1	68	1.57E-13
Hydroxy compounds: alcohols or phenols	110	39.4	258	21.4	1.8	1.02E-09
Alcohols	11	3.9	196	16.2	4.2	-2.19E-09
Sulfonic acid derivatives	34	12.2	50	4.1	3	1.54E-06
Sulfonic acids	20	7.2	18	1.5	4.8	2.04E-06
Aryl halides	71	25.4	164	13.6	1.9	2.29E-06
Halogen derivatives (alkyl, alkenyl, aryl)	99	35.5	268	22.2	1.6	4.68E-06

- 473 **Table 4.** Comparison of EC50 values from literature and from this study. Assays include the TTR-
- 474 radiolabeled ligand binding assay (¹²⁵I-T4) as well as the fluorescein-5-isothiocyante (FITC-T4) and 8-
- 475 anilino-1-naphthalene sulfonic acid (ANSA) fluorescent binding assays. Percent activity from single point
- 476 screening in this study is also reported to explain why some chemicals do not have a reported EC50 (e.g.,
- 477 <85% activity in SC was not run in concentration response). **Chemicals from the blind and*

	Previo	us TTR scre	This study		
Chemical	¹²⁵ I-T4	FITC-T4	ANSA	ANSA	% Activity in
	EC50 (µM)	EC50 (µM)	EC50 (µM)	EC50 (μM)	Single conc.
T4	0.049 ²	0.1 ⁵	0.03 ¹	0.075	
	0.055 ⁴	0.057 ⁸	0.21 ³		
	0.091 ⁶	0.2611	0.42 ⁸		
	0.088 ⁷	0.26 ¹³	0.26 ¹⁰		
	0.087 ⁹	0.031 ¹⁴	0.685 ¹⁶		
	0.0812		0.68518		
	0.06115				
Tetraiodothyroacetic acid (Tetrac)		0.0298	0.28 ⁸	0.016	105
Triiodothyroacetic acid (Triac, Tiratricol)		0.0208	0.28 ⁸	0.021	105
2,4,6-tribromophenol	0.0048 ⁴ 0.0672 ⁹	0.511	0.37 ¹⁸	0.028	105
2,4,6-trichlorophenol			1.41 ¹⁸	0.04	100
2-perfluorohexyl ethanol	ND ¹⁵			NA	56.8
4-nonylphenol		16 ⁵		3	89.2
Amiodarone		1.9 ⁸	>24 ⁸	NA	48.4
Benzoic acid			>100016	NA	-17.1
Bisphenol A	ND ⁹			8.63	96
Bisphenol A diglycidyl ether	ND ⁹			NA	39.5
Decanoic acid	ND ¹⁵			7.4	93.7
Fluorotelomer alcohol 8:2		ND ¹⁴		NA	45.8
Hexanoic acid	ND ¹⁵			NA	11.2
Linoleic acid			6.5 ¹⁰	NA	74.5
Mono(2-ethylhexyl)phthalate (MEHP)		13.08 ¹¹	31.55 ¹¹	1.34	99
Methimazole		>108	>24 ⁸	NA	60.3
N-ethyl perfluorooctane sulfonamide	ND ¹⁵			1.0	94.7
Octanoic acid	ND ¹⁵			NA	80.5
Oleic acid			3.3 ¹⁰	3.0	98.2
Perfluorobutane sulfonate	19.46 ¹⁵ †	13.331 ¹⁶ †		1.76	99.4
Perfluorodecanoic acid	8.954 ¹⁵	3.1 ⁵ 1.623 ¹⁴	0.71 ³	0.65	102.9
Perfluoroheptanoic acid	1.565 ¹⁵	1.2 ⁵ 1.128 ¹⁴	0.4 ³	0.21	102.2
Perfluorohexane sulfonate	0.71715	0.594 ¹⁴ †		0.09	102.4

⁴⁷⁸ *leaderboard sets withheld until the end of the Tox24 challenge.*

Perfluorohexanoic acid	8.22 ¹⁵	5.6 ⁵	1.4 ³	1.05	96.4
		3.189 ¹⁴			
Perfluorononanoic acid	2.737 ¹⁵	1.1 ⁵		0.2	104.7
		1.977 ¹⁴			
Perfluorooctane sulfonamide	6.124 ¹⁵	0.73 ⁵		0.61	103.1
Perfluorooctane sulfonate	0.94 ¹⁵	0.1314+		0.13	104.2
		2.1 ¹⁷ †			
Perfluorooctane sulfonic acid		0.25 ⁵		0.09	104.9
		1.21 ¹¹			
Perfluorooctanoic acid	0.949 ¹⁵	1.1 ⁵		0.15	103.5
		2.0211			
		0.378 ¹⁴			
Perfluoroundecanoic acid	21.56 ¹⁵	3.1 ⁵	1.99 ³	0.69	101.4
		5.339 ¹⁴			
Propylparaben		19.0 ⁵		5.0	96.8
Tetrabromobisphenol A	0.0314	0.034 ⁵		0.02	105.8
	0.0077 ⁹	0.2211			
Tetrachlorobisphenol A	0.1068 ⁹			0.03	105.2
Triclosan		1.1 ⁵		0.16	106
		0.9311			

480 *Chemicals that bind TTR in the literature are often referred to as "TTR inhibitors" because they

481 potentially inhibit TH from binding TTR. As such, results from TTR assays in found in the literature are

482 often reported as IC50s compared to EC50s reported in this study. For clarity, all the values will be

483 referred to as EC50s in this discussion.

¹Cao 2010, ²Chauhan 2000, ³Degitz in review, ⁴Hamers 2006, ⁵Hamers 2020, ⁶Hill 2017 ⁷Lans 1993,

485 ⁸Leusch 2018, ⁹Meerts 2000, ¹⁰Montaño 2012, ¹¹Ouyang 2017, ¹²Radovic 2006, ¹³Ren and Guo 2012,

486 ¹⁴Ren 2016, ¹⁵Weiss 2009, ¹⁶Xi 2020, ¹⁷Xin 2018, ¹⁸Yang 2019. †May be different formulation from what

487 was screened in this study; no CAS was provided in the reference literature for comparison. These

488 chemicals in the ToxCast libraries were provided as potassium salt.

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497 Figures and Figure Legends

Figure 1. Fluorescence of chemicals from the ToxCast phase 1_v2, phase 2, and e1k libraries at a target concentration of 100 uM. Chemicals are ordered from low to high according to the average relative fluorescence units (RFUs) of three replicate plates. The dashed line denotes 10% of the maximum fluorescence value from DMSO wells across all plates, which was the maximum chemical autofluorescence set for this study. Chemicals above the dashed line (i.e., those with RFUs >1026) were excluded from further analysis. There were 68 additional chemicals not depicted on the plot due to RFUs ranging from 10,200 to "overflow" (≥100,000).

506	Figure 2. Displacement of ANSA from transthyretin (TTR) by chemicals in single-concentration
507	screening of the ToxCast phase 1_v2, phase 2, and e1k libraries at a target concentration of 100
508	uM. Results are displayed as percent of control with median (black square) and range (line) of
509	three replicates. (A) All chemicals, (B) Expanded plot of chemicals with ≥85% displacement
510	(≤15% of control; displacement is 100-percent of control). Chemicals are plotted by rank order
511	based on median % of control from low to high. Chemicals further tested in concentration-
512	response screening are those below the orange dashed line which denotes 85% displacement.
513	

- **Figure 3.** Concentration-response curves for binding to transthyretin by T4 at eight concentrations of the model ligand T4 (A) and selected chemicals at twelve concentrations with
- 516 three replicates at each concentration (black circles). Examples include nine of the top twenty-
- 517 five ranked inhibitors (B-J) selected from Table 2 and two chemicals with ~90% activity in single
- 518 concentration screening (K-L) to represent a variety across types of compounds and inhibition
- 519 curves.





573 Figure 3



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