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# Design, synthesis, bioactivity, and DFT calculation of 2-thiazolylhydrazone derivatives as influenza neuraminidase inhibitors

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#### Abstract

Three series of thiazolylhydrazone derivatives were designed, synthesized, and evaluated for their neuraminidase (NA) inhibitory activity against influenza virus H1N1 in vitro. Compounds 1 and 2 were synthesized via the one-pot reaction and compound 3 was synthesized in two steps. Pharmacological results showed that the majority of the target compounds 1, 2, and 3 exhibited moderate-to-good influenza NA inhibitory activity. The NA inhibitory activity of the most active compound 2g (IC<sub>50</sub> = 7.12  $\mu$ g/ml) is better than that of the lead compound **A**. Molecular docking was performed to study the possible interactions between compound 2g and the active site of NA. On the basis of biological results, a preliminary structure–activity relationship (SAR) was derived and discussed. Moreover, density functional theory (DFT) calculation was also performed to explain why the thiazolylhydrazone skeleton has NA inhibitory activity, especially compound 2g with the most potent inhibitory activity.

Keywords Thiazolylhydrazones · Neuraminidase (NA) inhibitors · Molecular docking · DFT calculation

# Introduction

Influenza commonly known as an infectious epidemic is a major cause for health concern and economic costs. According to statistics from WHO, seasonal influenza can cause 2–5 million infections and 250,000–500,000 deaths each year worldwide (Krammer et al. 2015; Dawood et al. 2012). Despite the fact that flu vaccine is effective to prevent influenza virus infection, it still needs updating as the influenza virus mutates annually and flu vaccine cannot treat large-scale influenza outbreaks (Ellebedy et al. 2009). However, it was reported that there are two main glycoproteins–hemagglutinin (HA) and neuraminidase (NA) on the surface of virus, which are responsible for the invasion of viruses and the release of offspring virus, respectively

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<sup>1</sup> College of Chemistry and Chemical Engineering, Hunan University, 410082 Changsha, China (Colman et al. 2012; Chavas et al. 2010). Moreover, further study indicated that over ten amino acid residues of neuraminidase's active site are highly conserved (Feng et al. 2012; Lou et al. 2014). Hence, compared with other targets, NA is an attractive target for anti-influenza research.

Currently, Zanamivir and Oseltamivir are two effective NA inhibitors that were approved in many countries (Baz et al. 2007; Ison 2011). Among them, Oseltamivir is the first-line drug for controlling pandemic influenza (Hata-keyama et al. 2007). However, more and more influenza virus strains are resistant to it, such as the seasonal H1N1 viruses and avian H5N1 strains (Takano et al. 2013). Zanamivir is rarely used because of their low bioavailability and rapid elimination analysis (MIST Study Group 1998). Thus, it is urgent to develop new and potential antiviral drugs to fight against human influenza pandemic.



Zanamivir

Oseltamivir

In our previous studies, we found that compounds containing the hydrazone fragment always showed good NA inhibitory activity such as (E)-2-((2-(4-(tert-butyl)-5-(1H-1,2,4-triazol-1-yl)thiazol-2-yl)hydrazono)methyl)-4,6-dinitrophenol hydrobromide (A, Fang et al. 2016) and 3-((4-(tbutyl)-2-(2-benzylidenehydrazinyl) thiazol-5-yl) methyl) quinolin-2(1H)-ones (B, Yuan et al. 2017). Moreover, in 2011. (Liu et al. 2011) found that the series of 2-(2-aminothiazol-4-yl) acetic acid derivatives showed good NA inhibitory activity, and the IC<sub>50</sub> value of the most potent compound C was 1.28 µg/ml (Liu et al. 2011). In order to find more potent NA inhibitors, we kept the thiazolylhydrazone group of compound A or B and introduced ethyl acetate at the 4-position of the thiazole ring to design compound 1. However, compared with the lead compounds A and **B**, the activity of compound **1** is not improved. So we introduced the methyl at the 4-position and acetyl at the 5position of the thiazole ring to design compound 2. Fortunately, we found that compound 2 showed better activity than the lead compounds A and B. Meanwhile, to make sure if acetophenone thiazolylhydrazone can affect the activity against NA, we designed a series of acetophenone thiazolylhydrazone derivatives 3 (Fig. 1). Compounds 1 and 2 were synthesized via a one-pot reaction, while compound 3 was synthesized in two steps. To further discuss the interaction of target compounds with NA, density functional theoretical (DFT) calculation and Ledock were carried out. The results show an obvious NA inhibitory activity regularity and excellent molecular docking effect.

## **Results and discussion**

## Chemistry

Compounds 1 and 2 were synthesized via a one-pot reaction from substituted benzaldehyde derivative 4, thiosemicarbazide,  $\alpha$ -haloketone 5, and catalytic sodium acetate refluxing in ethanol (Scheme 1). Compared with 3-bromineacetylacetone, the reaction selectivity of ethyl 4chloroacetoacetate was so poor that the yield of compound 1 (41.8–70.0%) was lower than that of compound 2 (52.4–92.1%). Instead of the one-pot reaction, compound **3** was easily synthesized in a two-step process with better yields. As a first step, the condensation of acetophenone derivative 6 and thiosemicarbazide was typically carried out in ethanol with acetic acid as the catalyst to produce thiosemicarbazone 7. As a second step, thiosemicarbazone 7 was cyclized with 3-bromineacetylacetone in ethanol to obtain compound 3. All the target compounds were characterized by nuclear magnetic resonance (NMR) spectroscopy and mass spectrometry (MS).

#### In vitro inhibitory activities on NA

The 32 target compounds were evaluated for the NA inhibitory activity against influenza virus neuraminidase (H1N1) in vitro using Oseltamivir as positive control. The preliminary biological results of three series of thiazo-lylhydrazone derivatives (Tables 1–3) show that many compounds displayed moderate-to-good inhibitory activity against NA.

As shown in Table 1, the activities of compound 1 were generally lower than the lead compounds **A** and **B**. The most active one is compound 1c (R=4-OH) with an IC<sub>50</sub> value of  $17.92 \pm 1.60 \mu$ g/ml. To find out the reason why the activity is so poor, compound **C** was synthesized and evaluated for its NA inhibitory activity for activity control. However, unlike the reported activity result in the literature (Liu et al. 2011), compound **C** exhibited no inhibitory activity against NA. So we designed the target compound **2** for activity comparison. As a result, the ethyl acetate substituent at 4-position of the thiazole ring cannot enhance the activity.

Activity results (Table 2) suggest that all the compounds, including compound 2 display over 50% inhibition rates at the test concentration of 40 µg/mL. Moreover, there are two compounds 2g and 2j with inhibition rates of over 90%. With further testing for  $IC_{50}$  values, compound 2 shows the IC<sub>50</sub> values ranging from 7.12 to 34.31 µg/ml. Especially, the most potent compound 2g shows the IC<sub>50</sub> value of 7.12  $\mu$ g/ml, which is better than the lead compound **A** or **B**. Most of compound 2 with substituent R on the benzene ring is more active than the unsubstituted compound 2n (IC<sub>50</sub> = 13.67  $\mu$ g/ml). In terms of the substituent **R** at the 4-position of the benzene ring, some hydrophilic groups, such as carboxylate (2j,  $IC_{50} = 9.34 \,\mu g/ml$ ) and hydroxyl (2c,  $IC_{50} =$ 11.25 µg/ml) on the benzene ring, tend to enhance the activity significantly. Furthermore, some hydrophobic groups, such as carboxylate (2j,  $IC_{50} = 9.34 \mu g/ml$ ), halogen  $(2m, IC_{50} = 13.39 \,\mu g/ml)$ , nitro-  $(2s, IC_{50} = 15.08 \,\mu g/ml)$ , and acetylamino (2u,  $IC_{50} = 13.14 \,\mu\text{g/ml}$ ), also can enhance the activity. However, hydrophobic groups, such as the methoxy (2q,  $IC_{50} = 27.58 \,\mu\text{g/ml}$ ) and dimethylamine (2k,  $IC_{50} = 34.31 \,\mu g/ml$ ), weaken the activity instead. The hydrophilic substituents have a more pronounced effect than the hydrophobic substituents on the inhibition activity.

The influence on the activities of substituent R at the 4position of the benzene ring is as follows: COOCH3 > COOH > OH > NHCOCH<sub>3</sub> > F >NO<sub>2</sub> > H > NH<sub>2</sub> > OCH<sub>3</sub> > N(CH<sub>3</sub>)<sub>2</sub>. In general, most of compound **2** possesses better activity than compound **1**. So we can draw the conclusion that the influence on the activities of substituent groups at 4and 5-position of the thiazole ring is as follows: 4-CH<sub>3</sub>-5-COCH<sub>3</sub> > 4-CH<sub>2</sub>CO<sub>2</sub>Et.



Fig. 1 Design of target compounds

Scheme 1 Synthesis of target compounds



**a**: R = 2-OH, **b**: R = 3-OH, **c**: R = 4-OH, **d**: R = 2,4-(OH)<sub>2</sub>, **e**: R = 2-OH-3-OCH<sub>3</sub>, **f**: R = 3-OH-4-OCH<sub>3</sub>, **g**: R = 4-OH-3-OCH<sub>3</sub>, **h**: R = 3,4-(OH)<sub>2</sub>, **i**: R = 4-COOCH<sub>3</sub>, **j**: R = 4-COOH, **k**: R = 4-N(CH<sub>3</sub>)<sub>2</sub>, **l**: R = 3-F, **m**: R = 4-F, **n**: R = H, **o**: R = 3-Cl, **p**: R = 2,4-Cl<sub>2</sub>, **q**: R = 4-OCH<sub>3</sub>, **r**: R = 3,4-(OCH<sub>2</sub>O), **s**: R = 4-NO<sub>2</sub>, **t**: R = 4-NH<sub>2</sub>, **u**: R = 4-NHAc

Table 1 Inhibitory activity of compound 1 against NA in vitro

Compound	R	Inhibition rate (%)	IC <sub>50</sub> (µg/ml)
1a	2-OH	41.96	NA <sup>a</sup>
1b	3-OH	67.96	$21.02 \pm 2.41$
1c	4-OH	73.22	$17.92 \pm 1.60$
1d	2,4-(OH) <sub>2</sub>	55.90	$31.83 \pm 1.07$
1e	2-OH-3-OCH <sub>3</sub>	47.54	NA
1f	3-OH-4-OCH <sub>3</sub>	19.47	NA
1g	4-OH-3-OCH <sub>3</sub>	56.99	$31.54 \pm 1.26$
$\mathbf{C}^{b}$	-	-1.99	NA
C <sup>c</sup>	-	-	1.28

<sup>a</sup>The inhibition rate is less than 50% at the the test concentration of  $40 \,\mu\text{g/mL}$ 

<sup>b</sup>The activity result in test experiment

<sup>c</sup>Activity values in the literature (Liu et al. 2011)

In order to make sure if the CH<sub>3</sub> on  $\mathbb{R}^3$  can affect the activity against NA, we designed and synthesized compound **3**. As shown in Table 3, only compounds **3a** and **3d** with 2-OH and 2,4-di-OH on the benzene ring showed the potent inhibition activities against NA with IC<sub>50</sub> values of 22.46 and 19.86 µg/ml, respectively, which are much lower than those of compound **2**. As a result, substituent CH<sub>3</sub> on  $\mathbb{R}^3$  can weaken the inhibition activity. In summary, the SAR of the 2-thiazolylhydrazone derivatives is summarized in Fig. 2.

#### **Docking analysis**

In order to understand the interaction between the thiazolylhydrazone scaffold and the NA active site, the representative compounds **1g**, **2g**, and **3c** were docked into the active sites of NA (H1N1, PDB entry: 3TI6), respectively,

Table 2	Inhibitory	activity	of	compound	2	against	NA	in	vitro
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Compound	R	Inhibition rate (%)	IC <sub>50</sub> (µg/ml)
2a	2-OH	77.62	16.19 ± 2.75
2b	3-OH	87.93	$11.83 \pm 1.23$
2c	4-OH	85.77	$11.25 \pm 0.23$
2d	2,4-(OH) <sub>2</sub>	88.57	$12.91 \pm 1.73$
2e	2-OH-3-OCH <sub>3</sub>	89.39	$12.66\pm0.60$
2f	3-OH-4-OCH <sub>3</sub>	85.98	$14.15 \pm 2.71$
2g	4-OH-3-OCH <sub>3</sub>	93.33	$7.12\pm0.80$
2h	3,4-(OH) <sub>2</sub>	65.13	$23.00 \pm 1.89$
2i	4-COOCH <sub>3</sub>	89.93	$8.61 \pm 0.12$
2j	4-COOH	91.16	$9.34 \pm 0.46$
2k	4-N(CH <sub>3</sub> ) <sub>2</sub>	54.51	$34.31 \pm 3.24$
21	3-F	73.19	$17.08 \pm 3.45$
2m	4-F	85.29	$13.39 \pm 1.28$
2n	Н	78.74	$13.67 \pm 1.37$
20	3-C1	86.38	$12.44 \pm 1.06$
2p	2,4-Cl <sub>2</sub>	64.52	$22.14 \pm 3.81$
2q	4-OCH <sub>3</sub>	63.99	$27.58 \pm 2.51$
2r	3,4-(OCH <sub>2</sub> O)	71.68	$21.05\pm2.03$
2s	4-NO <sub>2</sub>	86.79	$15.08\pm0.19$
2t	4-NH <sub>2</sub>	84.94	$14.90 \pm 1.31$
2u	4-NHAc	80.99	$13.14 \pm 1.18$

Table 3 Inhibitory activity of compound 3 against NA in vitro

Compound	R	Inhibition rate (%, 40 µg/ml)	IC <sub>50</sub> (µg/ml)
<b>3</b> a	2-OH	67.36	22.46 ± 3.23
3b	3-OH	41.87	NA <sup>a</sup>
3c	4-OH	47.55	NA
3d	$2,4-(OH)_2$	74.60	$19.86 \pm 2.25$

 $^{a}\text{The inhibition rate is less than 50\% at the test concentration of 40 <math display="inline">\mu\text{g/mL}$ 

using LeDock (http://www.lephar.com/) with default parameters, and the results were analyzed and visualized using PyMOL (http://pymol.sourceforge.net/) (Wang et al. 2016; Zhao et al. 2012). LigPlot+v1.4.5 was used to depict the 2D interaction diagram (Wallace et al. 1995).

According to the results in Fig. 3 (A1), it could be found that the structure orientation of compound 2g and oseltamivir structure in the SA cavity are similar and they can fit well with the SA cavity. There are six hydrogen bonds formed between compound 2g and the amino acid residues of NA (Fig. 3 (A2)). The carbonyl group at the 5-position of the thiazole ring has a similar orientation with the acetamino group of Oseltamivir acid. Both of them form two hydrogen bonds with the amino acid residues of Arg 371 and Arg 292, which is one of the reasons why the activity of acetyl substitution at the 5-position of the thiazole ring is better than others. Besides, similar with the carboxyl on oseltamivir acid interacting with a residue of Arg152, 3methoxy and 4-hydroxyl groups on the benzene ring have strong interactions with residues of Arg152 and Trp178. In addition, the structural fragment CH=N of Schiff base structure can also be interacting with the residues of Glu 119 and Tyr 406 by hydrogen bonds. In summary, the substituents on the phenyl ring, thiazole ring, and the schiff base structure are all playing essential roles in contributing to the higher inhibition activity against NA.

As shown in Fig. 4 (B1), the structure orientation of compound 1g is also similar with oseltamivir in SA cavity. However, the 4-CH<sub>2</sub>CO<sub>2</sub>Et on the thiazole ring extends beyond the 430-cavity. Besides, the hydrazone fragment is located on the corner of SA active cavity and 430 activity cavity. Neither 4-CH<sub>2</sub>CO<sub>2</sub>Et on the thiazole ring nor the hydrazone fragment is deeply inserted into the two activity cavities. So they cannot interact strongly with the NA activity cavity. There are only three binding sites forming four hydrogen bonds (Fig. 4 (B2)). That is the reason why the activity of compound 1 with 4-CH<sub>2</sub>CO<sub>2</sub> Et substituent on the thiazole ring is lower than that of compound 2 with 4-CH<sub>3</sub>-5-COCH<sub>3</sub> on the thiazole ring. In Fig. 4 (C1), the entire structure of compound 3c is hardly inside of the SA activity cavity and 430 activity cavity. Because of the effect of the methyl group on the hydrazone fragment, the thiazolylhydrazone skeleton cannot be inserted into the two activity cavities and they may be detached from the surface of NA activity cavity. There are two binding sites forming four hydrogen bonds (Fig. 4 (C2)), but the two sites are not able to immobilize compound **3c** on the activity cavity. So compound 3c displays poor activity. The docking analysis result is consistent with the SAR analysis.

#### **Theoretical calculation**

Four electronic structure parameters of compound 2 were calculated, including the HOMO and LUMO orbital energy levels (E<sub>HOMO</sub>, E<sub>LUMO</sub>), energy-level difference  $(\Delta E)$ , and oil-water partition coefficient (Log P). The representative calculation results were shown in Table 4 (more calculation results can be found in Supporting information). From the calculation results, it can be found that  $E_{\text{HOMO}}$  and  $\Delta E$  of the target compound 2 are not only close to each other, but also close to those of oseltamivir and oseltamivir acid. The energy-level difference ( $\Delta E$ ) of hydrophilic or electron-donating substituents is much closer to that of oseltamivir and oseltamivir acid, such as compounds 2c, 2g, and 2r. Moreover, since the introduction of electron-donating substituents or molecular conjugate groups can contribute to improving the  $E_{HOMO}$ and  $E_{LUMO}$ , it is significative to promote these energy levels of the target compounds closer to oseltamivir and oseltamivir acid to improve the biological activity.



Fig. 3 Specific interactions of compound 2g and Oseltamivir acid binding to the active site of NA (H1N1, PDB: 3TI6). A1 The docking result of compound 2g and Oseltamivir acid binding to the active site

of NA (H1N1, PDB: 3TI6); A2 interaction between compound 2g with the corresponding amino acid residues of NA; A3 the 2D binding mode of compound 2g

According to the frontier molecular orbital theory, HOMO and LUMO orbital energy levels are the most important factors that affected bioactivity (Nataraj et al. 2013). A study of the frontier orbital energy can provide some useful information for the active mechanism. DFT study is one of the most widely used computational methods due to its accuracy and less time consumption (Suvitha et al. 2014). So further calculation on frontier molecular orbital theory was conducted.

As shown in Fig. 5, the LUMO orbital of compound 2g is mainly distributed at the nitrogen atom of the thiazole ring and the carbon atom between the nitrogen atom and the sulfur atom, while the HOMO orbital is distributed at the

carbonyl group. The LUMO orbitals of oseltamivir or oseltamivir acid are mainly distributed at the carbonyl group of the carboxyl or ester group, while HOMO orbitals are distributed at the acetamide bond, especially at the carbonyl group of the acetamide bond. Figure 6 indicates that the HOMO orbital distribution of compound 2g and oseltamivir acid is almost identical on the structure of carbonyl. In addition, the electron transfer's direction from the HOMO to the LOMO orbit of 2g and oseltamivir acid is in accordance as well. According to the direction of electron transfer, it can be speculated that the electron-withdrawing groups on the benzene ring are more beneficial to electron transfer, which is similar with the effect of the carboxyl Fig. 4 Specific interactions of compound 1g, 3c, and Oseltamivir acid binding to the active site of NA (H1N1, PDB: 3TI6). B1 The docking result of compound 1g and Oseltamivir acid binding to the active site of NA (H1N1, PDB: 3TI6); B2 interaction between compound 1g with the corresponding amino acid residues of NA; C1 the docking result of compound 3c and Oseltamivir acid binding to the active site of NA (H1N1, PDB: 3TI6); C2 interaction between compound 3c with the corresponding amino acid residues of NA



Table 4 Partial electronic
structure parameters of
compounds 2, 3, and
Oseltamivir

Compound	IC <sub>50</sub> (µg/ml)	$E_{\text{HOMO}}$ (a.u.)	$E_{\text{LUMO}}$ (a.u.)	$\Delta E$ (a.u.)	Log P
2c	$11.25 \pm 0.23$	-0.24474	-0.00987	0.23487	2.82
2g	$7.12 \pm 0.80$	-0.24493	-0.01052	0.23441	2.69
2ј	$9.34 \pm 0.46$	-0.25171	-0.01712	0.23459	2.84
2k	$34.31 \pm 3.24$	-0.23706	-0.00409	0.23297	3.49
2q	$27.58 \pm 2.51$	-0.24225	-0.00899	0.23326	3.08
2r	$21.05 \pm 2.03$	-0.24489	-0.00990	0.23499	2.99
3a	$22.46 \pm 3.23$	-0.24239	-0.00491	0.23748	2.39
3b	NA <sup>a</sup>	-0.24447	-0.01263	0.23184	2.39
Oseltamivir		-0.22892	0.01503	0.24395	0.19

<sup>a</sup>NA: the inhibition rate is less than 50% at the test concentration of  $40 \,\mu\text{g/mL}$ 

group on oseltamivir. To some extent, the frontier molecular orbital theory can explain the reason why the target compounds have anti-influenza activities.

Besides, the target compounds' oil-water partition coefficients (Log P) are greater than those of oseltamivir and oseltamivir acid. Among compound 2, the Log P of compounds 2q, 2j, and 2k is also greater than that of the most potent bioactivity compound 2g. The calculation result of Log P is consistent with the conclusion that the hydrophilic groups are more conducive to increased activity in the SAR analysis. So we can modify the lead compound by decreasing the Log P value and enhancing the water solubility to improve anti-influenza activity.

# Conclusions

Three series of compounds were designed, synthesized, and evaluated for their ability to inhibit NA of influenza H1N1 virus. Compound 2 has better activity than compound 1. The activities of compounds 2g and 2i with the IC<sub>50</sub> values of 7.12 and 8.61 µg/ml, respectively, are superior to the lead compound B. The SAR analysis indicates that most of the substituents of R at the 4-position of the benzene ring can increase the inhibition activity, wherein the hydrophilic substituents have a more pronounced effect than the hydrophobic substituents on the inhibition activity. The specific influence on the activity of the substituent groups at 4-position  $(R^1)$  and 5position  $(\mathbb{R}^2)$  on the thiazole ring is as follows: 4-CH<sub>3</sub>-5- $COCH_3 > 4$ - $CH_3CO_2Et$ -5-H. The substituent  $CH_3$  on  $R^3$  can weaken the inhibition activity. Molecular docking indicates that the structure orientations of thiazolylhydrazone derivatives can fit well with the SA cavity. The thiazole ring and the structural fragment CH=N of the thiazolylhydrazone skeleton can be interacting well with the amino acid residues by hydrogen bonds. DFT calculation suggests that the electron transfer's direction of compound 2g from the HOMO to the LOMO orbit is in accordance with that of oseltamivir acid. In addition, the Fig. 5 Frontier molecular orbital energy level and distribution of compound 2g, Oseltamivir acid, and Oseltamivir

LUMO Oseltamivir acid LUMO Oseltamivir LUMO 2g ELUMO = -0.01052 ELUMO = 0.00943 ELUMO = 0.01503 ∆E= 0.24395 ∆E= 0.23992 ΔE=0.23441 Еномо = -0.23049 Еномо = -0.22892 Еномо = -0.24493 HOMO 2g HOMO Oseltamivir acid HOMO Oseltamivir Electron transfer direction Fig. 6 Comparison of the frontier orbital distribution and the direction of electron transfer of compound 2g and oseltamivir acid LUMO 2g HOMO 2g Electron transfer direction LUMO Oseltamivir acid HOMO Oseltamivir acid

lower Log P of thiazolylhydrazone derivatives also can contribute to improving activity. In summary, the thiazolylhydrazone skeleton could show potent NA inhibitory activity, which contributes to designing novel influenza NA inhibitors.

## **Experiments**

#### Chemistry

The starting materials and solvents were commercially available and used without further purification. All reactions were monitored by thin-layer chromatography (TLC) on 25.4-6.2-mm silica gel plates (GF-254). Melting points were measured on an X-4 electrothermal digital melting point apparatus and uncorrected. Nuclear magnetic resonance (NMR) was recorded on a Varian INOVA-400 spectrometer apparatus using tetramethylsilane as an internal standard. The solvents for NMR were DMSO- $d_6$ . Mass spectra data were obtained by an LCQ Advantage MAX spectrometer electrospray ionization-MS and an Agilent 1100 series LC-MS. The general procedure for the synthesis of compounds 1, 2, and 3 can be found in Supporting information.

#### General procedure for the synthesis of compounds 1a-1g

A mixture of substituted benzaldehyde **4** (2 mmol), thiosemicarbazide (2 mmol), 4-chloro ethyl acetoacetate (2.4 mmol), and sodium acetate (0.1 mmol) in ethanol (10 mL) was refluxed for 6 h. After the completion of the reaction confirmed by TLC, the reaction mixture was cooled at room temperature, and then poured into 10-ml saturated NaHCO<sub>3</sub> solution to adjust the pH to 8–10. The precipitate was filtered and washed with brine, recrystallized from ethyl acetate/petroleum ether, or ethanol to afford the pure product **1a–1g**.

## General procedure for the synthesis of compounds 2a-2s

A mixture of substituted benzaldehyde **4** (2 mmol), thiosemicarbazide (2 mmol), and 3-bromoacetylacetone (2.4 mmol) and sodium acetate (0.1 mmol) in ethanol (10 mL) was refluxed for 6 h. After completion of the reaction confirmed by TLC, the reaction mixture was cooled at room temperature, and then poured into 10 -ml saturated NaHCO<sub>3</sub> solution to adjust the pH to 8–10. The precipitate was filtered and washed with brine, and recrystallized from ethanol to afford the pure compounds **2a–2s**.

## Procedure for the synthesis of compound 2t

A mixture of compound **2s** (2 mmol), iron powder (15 mmol), dichloromethane (20 ml), water (20 ml), and glacial acetic acid (20 ml) was vigorously stirred at room temperature for 15 h. After the completion of the reaction confirmed by TLC, the precipitate was filtered and washed with dichloromethane (50 ml). Then saturated sodium bicarbonate was dropped into the filtrate to adjust the pH to 7–8. An organic layer was washed three times with water, dried with anhydrous sodium sulfate, and evaporated the solvent to afford the pure compound **2t**.

#### Procedure for the synthesis of compound 2u

1,1'-Carbonyldiimidazole (1.2 mmol) was added into the mixture solution DMF (6 ml) and acetic acid (1.2 mmol) in two portions and stirred for 30 min at room temperature. Then compound **2t** (1 mmol) was added into the reaction solution. The mixture was stirred at 85 °C for 5 h (confirmed by TLC), and cooled at room temperature. The reaction solution was poured into 10 ml of water and stirred for 30 min. The precipitate of the product was filtered and washed with water to afford the pure compound **2u**.

## General procedure for the synthesis of compounds 3a-3d

The appropriate thiosemicarbazide (5.0 mmol), substituted acetophenone 6 (5.5 mmol), was suspended in ethanol

(20 ml), and two drops of acetic acid were added to the above solution. The reaction mixture was refluxed for 6–8 h and then cooled at room temperature. The resulting precipitate was filtered and washed with brine to obtain the corresponding thiosemicarbazone derivative **7**.

A mixture of thiosemicarbazone derivative 7 (2 mmol) and 3-bromoacetylacetone (2.4 mmol) in ethanol (10 mL) was refluxed for 6 h. The same workup as the synthesis of compounds **1a–1s** was carried out to afford the products **3a–3d**. The spectral data and figures of target compounds are shown in Supporting information.

#### Neuraminidase inhibition assay

All the target compounds were tested for their NA inhibitory activity in vitro using Oseltamivir as positive control. Influenza virus A/PR/8/34, donated by Chinese Centers for Disease Control, was used as a source of NA in enzyme inhibition assays based on the method reported by Guanhua Du (Liu et al. 2005; Zhang et al. 2008). The NA was obtained by the method described by Laver et al. (1984). The compound 2'-(4-methylumbellifer-yl)- $\alpha$ -D-acetyl neuraminic acid (MUNANA) was purchased from Sigma as the substrate of NA. Cleavage of this substrate by NA produces a fluorescent product, which can emit an emission wavelength of 450 nm with an excitation wavelength of 360 nm (Wetherall et al. 2003). The intensity of fluorescence can reflect the activity of NA sensitively (Mitrasinovic 2009).

The reaction mixture consisting of 10-µL solution of target compounds and 30-µL NA enzyme in 33 mmol/L MES buffer (pH 3.5) was added to a 96-well microtiter plate. Meanwhile, blank, enzyme, and a positive drug Oseltamivir were set. The reaction was started by the addition of a substrate containing 10 µL of 4 mmol/L CaCl<sub>2</sub>, 20 µL of 20 µmol/L MUNANA, and 30 µL of water to the plate. After incubation for 60 min, the reaction was terminated by adding 150 µL of 14 mmol/L NaOH in 83% ethanol. The resulting fluorescence was quantified at an excitation wavelength of 360 nm and an emission wavelength of 450 nm. The data are expressed as the mean of three independent experiments. The IC<sub>50</sub> value was calculated by plotting the percent of inhibition of NA activity versus the inhibitor concentration.

## Docking study

The crystal structure data of H1N1 neuraminidase–oseltamivir complex (PDB Code: 3TI6) were downloaded from RSCB Protein Data Bank. The docked compound **2g** was energy-minimized using the MM2 force field. Then LeDock was used to prepare the pdbqt files with default parameters (Wang et al. 2016; Zhao et al. 2012). The dimension of the binding box was set as ( $X_{min} = -37.4$ ,  $X_{max} = -19.8$ ,  $Y_{min} = 7.0$ ,

 $Y_{\text{max}} = 21.5$ ,  $Z_{\text{min}} = 12.0$ , and  $Z_{\text{max}} = 30.2$ ). The results were analyzed and visualized by PyMOL. LigPlot+v1.4.5 was used to depict the 2D interaction diagrams (Wallace et al. 1995).

## **DFT** calculation

The DFT calculations of the representative compounds were performed at the Becke–Lee–Parr hybrid exchange correlation three-parameter functional (B3LYP) level with standard 6-311G (d, p) basis set (Kohn et al. 1965; Becke 1993; Lee et al. 1998).

Vibration analysis showed that the optimized structure was in accordance with the minimum points on the potential energy surface. All of the convergent precisions were the system default values, and all the quantum chemical calculations in this study were performed using the Gaussian 09 program (Frisch et al., Gaussian 09, Revision A.1, Gaussian, Inc., Wallingford, CT, 2009). The calculated convergence accuracy is determined by the program default parameter.

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## **Compliance with ethical standards**

Conflict of interest The authors declare that they have no conflict of interest.

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