

**PCCP****Explosion limits of hydrogen-oxygen mixtures from nonequilibrium critical points**

Journal:	<i>Physical Chemistry Chemical Physics</i>
Manuscript ID	CP-ART-02-2018-000905.R2
Article Type:	Paper
Date Submitted by the Author:	18-May-2018
Complete List of Authors:	Newcomb, Lucas; University of Massachusetts Boston, Chemistry Marucci, Michael; University of Massachusetts Boston, Chemistry Green, Jason; University of Massachusetts Boston, Chemistry

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# Explosion limits of hydrogen-oxygen mixtures from nonequilibrium critical points

Lucas B. Newcomb,<sup>1</sup> Michael E. Marucci,<sup>1</sup> and Jason R. Green<sup>1,2,3,\*</sup>

<sup>1</sup>*Department of Chemistry, University of Massachusetts Boston, Boston, MA 02125*

<sup>2</sup>*Department of Physics, University of Massachusetts Boston, Boston, MA 02125*

<sup>3</sup>*Center for Quantum and Nonequilibrium Systems,  
University of Massachusetts Boston, Boston, MA 02125*

The explosion limits of hydrogen-oxygen mixtures are macroscopic, temperature-pressure boundaries that divide the overall chemistry of hydrogen oxidation into slow-burning and explosive regimes. Here, we demonstrate that it is possible to recover the three chemical explosion limits of H<sub>2</sub>/O<sub>2</sub> mixtures from nonequilibrium stochastic trajectories. This demonstration relies on the finding that, in explosive regimes, these trajectories have the quantitative features of a dynamical phase transition. Through computer simulations for both a generic and a reduced model for hydrogen oxidation, we find only one dominant reactive phase at temperatures below the explosion limits. At temperatures above the limits, however, a second phase transiently emerges from the chemistry. By locating the pseudo-critical temperature where two reactive phases are distinguishable, we construct all three explosion-limit boundaries for model hydrogen-oxygen mixtures of finite size.

Keywords: ignition — phase transitions — nonequilibrium statistical mechanics

## I. INTRODUCTION

Hydrogen combustion is of practical importance in applications that include space exploration<sup>1</sup> and renewable energy.<sup>2</sup> The chemically-driven phenomena that underlie these applications are also relevant to the efficient combustion and safe storage of hydrogen.<sup>1–5</sup> Hydrogen is an appealing source of power because of its high energy density and cleanliness compared to petroleum-based fuels.<sup>6</sup> Moreover, the chemistry of hydrogen oxidation plays a role in the combustion of other fuels.<sup>7</sup> Much progress has been made in the fundamental understanding of the behavior of hydrogen-oxidizer mixtures, particularly at a bulk level of description.<sup>8–10</sup> However, without a fully developed theory of nonequilibrium statistical mechanics,<sup>11</sup> it is less clear how the microscopic dynamics of combustion chemistry translates into bulk behavior.

It has long been known that the chemistry of hydrogen oxidation depends strongly on pressure, temperature, and mixture composition.<sup>8</sup> How thermodynamic variables control the kinetic and thermal feedback mechanisms underlying ignition is grounded in the “explosion limits”.<sup>8–10,12,13</sup> Below these limits, H<sub>2</sub>/O<sub>2</sub> mixtures experience a steady, slow burn. However, mixtures explode upon crossing these boundaries. In the latter regime, the pool of radicals proliferates and facilitates further decomposition of fuel and oxidizer. The characteristic chemicals that proliferate during explosions are the intermediate species (H, O, OH, H<sub>2</sub>O<sub>2</sub> and HO<sub>2</sub>), which lead to water. For hydrogen, the explosion limits have a characteristic “Z-shape” structure in the space of temperature and pressure.<sup>9,10,14</sup> Traveling from low to high pressure, the individual branches of the “Z” constitute the first, second, and third explosion limits, respectively: each having their own, unique dominant reactions.

Crossing an explosion limit takes only a small change in a thermodynamic field but has a large effect on reactive behavior and heat release – a response reminiscent of phase transitions.<sup>15,16</sup> By imposing constant temperature, which eliminates the contribution of reaction heat release during combustion, we have previously demonstrated that chemical explosions of H<sub>2</sub>/O<sub>2</sub> mixtures have (1) the quantitative features of a first-order dynamical phase transition above the second explosion limit and (2) that the critical temperature, below which ignition does not occur, converges to the second explosion limit temperature for sufficiently large systems at one atmosphere.<sup>17</sup> Although explosions necessarily generate heat, several works have shown that purely chemical feedback mechanisms can produce three explosion limit boundaries.<sup>6,14,18</sup> Here, we test the hypothesis that all points on these boundaries are critical points with two models for hydrogen combustion: one model based on a reduced set of elementary reactions and another (generic) model that captures some of the essential chemical processes.<sup>14</sup>

Over a range of temperatures and pressures, we simulate many trajectories of a reacting H<sub>2</sub>/O<sub>2</sub> system, each trajectory being a realization of the solution to the chemical master equation. We then show that ignition is a transient, dynamical phase transition<sup>19,20</sup> using trajectory observables. The results are evidence that previous findings are not unique to the reduced model used or the second explosion limit.<sup>17</sup> Here, after detailing the models and methods, we demonstrate an ability to map the “Z-shaped” explosion limits for two model mechanisms: evidence suggesting that macroscopic explosion limits are a family of nonequilibrium critical points. Looking ahead, if other igniting, fuel-oxidizer mixtures exhibit this phase behavior, then the approach we introduce here is a means of translating the microscopic chemical events of combustion chemistry into macroscopic explosion limits.

\* [jason.green@umb.edu](mailto:jason.green@umb.edu)

## II. MODELS AND SIMULATION METHODS

Fluctuations in the concentration of intermediates can stimulate ignition, so we simulate the stochastic evolution of reacting mixtures to investigate the underlying microscopic causes of explosion limits.<sup>21–23</sup> By explicitly accounting for fluctuations of intermediate species, this approach differs from traditional chemical kinetic modeling,<sup>12,14,24,25</sup> which is based on mean-field rate equations. As a proof-of-principle, we simulate the stochastic chemistry of two models for hydrogen combustion: (1) a reduced set of elementary  $\text{H}_2/\text{O}_2$  reactions and (2) a symbolic set of elementary steps.<sup>14</sup> Previous works demonstrated that these, and other, reduced mechanisms have three explosion limits.<sup>6,7,14,26,27</sup> Since the explosion limits of these mechanisms are known in the macroscopic limit, they can serve as a benchmark to test the hypothesis that all three limits exhibit the features of a nonequilibrium phase transition.

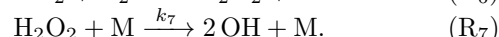
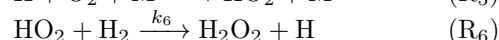
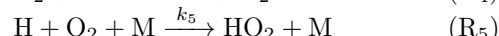
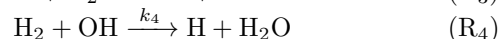
### A. Stochastic simulations of hydrogen oxidation

We model the stochastic time evolution of a finite number of reactant molecules with Gillespie’s exact stochastic algorithm.<sup>21–23</sup> All systems are initially composed of only reactants ( $\text{H}_2/\text{O}_2$  or R) in their stoichiometric ratios and evolve towards a final state dominated by the product ( $\text{H}_2\text{O}$  or P). For each temperature-pressure point simulated, we evolve a minimum of  $10^6$  trajectories. Along the nonequilibrium pathway to the steady-state, intermediates are born and destroyed by initiation, propagation, branching, and termination. To select the sequence of reactions, each elementary step is given a propensity,  $a_i$ . Bimolecular reactions with chemically distinct reactants have a propensity of  $k_i X_1 X_2 / N_a V$ . For termolecular reactions, the propensity is  $k_i X_1 X_2 X_3 / N_a^2 V^2$  when the reactants are chemically distinct and  $k_i X_1 X_2 (X_2 - 1) / 2 N_a^2 V^2$  when two reactants are identical: the factor  $X(X - 1) / 2$  avoids overcounting reaction pairs.<sup>21,22</sup> In all cases, the propensity has units of inverse time. Here,  $N_a$  is Avogadro’s number,  $V$  is the volume, and  $k_i$  is the rate coefficient for the  $i$ th reaction.

The propensities are used to determine reaction probabilities,  $a_i / \sum_m a_m$ . A uniform random number determines which reaction occurs, the system composition is updated by the stoichiometry of the selected reaction, and time is updated ( $t_{k+1} = t_k + \tau$ ) by the time between reactions,  $\tau = -(\sum_m a_m)^{-1} \ln x$  with  $x \in [0, 1]$ . Since the rate coefficients for the symbolic model have no units of time, we divide the time between reactions by the smallest rate constant such that both timescales are unitless to facilitate a comparison of the results for each model. The slowest reaction in both models is initiation, so we use the scaled time  $t/\tau_{\max}$  with  $\tau_{\max} = 1/k_{\text{initiation}}$  for both models.

### B. Reduced model for hydrogen oxidation

The reduced model<sup>14</sup> we use to simulate the overall reaction  $2\text{H}_2 + \text{O}_2 \rightarrow 2\text{H}_2\text{O}$  has seven irreversible reactions:



Initiation of a radical carrying chain, through R<sub>1</sub>, provides the initial radical(s) needed for ignition. Reactions 2 and 3 are low to medium pressure branching reactions and are important to the first and second explosion limits. Reaction 4 is the chain propagation step and the only reaction that produces water. The gas-phase (nominal) termination step, R<sub>5</sub>, is mainly responsible for suppressing ignition near the second limit. At high pressure, R<sub>6</sub> can feed directly into R<sub>7</sub> and sustain branching. Because these last two reactions require sufficiently high pressure to occur, they become significant in the kinetics at the third limit.

In this mechanism, the species M represents any gas-phase collision partner. We approximate the concentration, [M], with the ideal gas law,  $p/RT$ .<sup>28</sup> All systems begin as a stoichiometric mixture of  $\text{H}_2$  and  $\text{O}_2$ . As is common in the combustion literature,<sup>6,9,14,18,23,27</sup> the rate coefficient,  $k_i$ , for the  $i$ th gas-phase reaction is calculated using the modified Arrhenius equation,

$$k_i(T) = A_i T^{\delta_i} e^{-E_{a,i}/RT}, \quad (1)$$

where  $A_i$  is the pre-exponential factor,  $T$  is the temperature in Kelvin,  $\delta_i$  is the temperature-dependence exponent,  $E_{a,i}$  is the activation energy, and  $R$  is the molar gas constant. To model the dependence of reactions R<sub>5</sub> and R<sub>7</sub> on pressure, we use the Lindemann form:  $k_i = [\text{M}]^{-1} (1/k_\infty + 1/k_0[\text{M}])^{-1}$ , where the subscripts indicate infinitely high and zero pressure limits of  $k_i$ . Additionally, we treat all third-body species as having the same enhancement coefficient.

We model the wall termination of H and  $\text{HO}_2$  with rate constants that depend on the features of the reaction vessel,

$$k_{\text{wall}} = \frac{1}{4} \epsilon \bar{v} \frac{S}{V}, \quad (2)$$

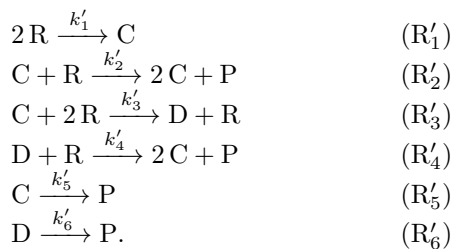
including the fraction of wall collisions that successfully terminate the radical,  $\epsilon$ , known as the “sticking coefficient”. We take the value of  $\epsilon$  to be  $10^{-3}$  for H and  $3 \times 10^{-3}$  for  $\text{HO}_2$ . Here,  $\bar{v}$  is the average thermal velocity of gas-phase molecules given by  $\sqrt{8k_B T / \pi M_m}$ , where  $k_B$  is the Boltzmann constant,  $T$  is the temperature in

168 Kelvin, and  $M_m$  is the molar mass of the terminating  
 169 species. The propensity of wall termination reactions is  
 170 taken to be  $k_{\text{wall}}X_j$ . We model our system as a spheri-  
 171 cal container with a surface area to volume ratio,  $S/V$ ,  
 172 of  $3/r$  and a fixed radius,  $r$ , of 0.074 cm. We only in-  
 173 clude the wall termination of H and HO<sub>2</sub> because, as  
 174 was shown previously for this model,<sup>14</sup> the destruction of  
 175 these species is sufficient to suppress the chain-branching  
 176 and give the first and third limits, respectively.

177 While our aim is to test the hypothesis that the entire  
 178 Z-shaped explosion boundary is composed of nonequilib-  
 179 rium critical points, the accuracy of the third explosion  
 180 limit, in particular, requires further comment. It is well-  
 181 known that the third limit is highly sensitive to the ele-  
 182 mentary reactions in the model; namely, those involving  
 183 HO<sub>2</sub> and H<sub>2</sub>O<sub>2</sub>, as we have seen in molecular dynam-  
 184 ics simulations.<sup>29</sup> It has been discussed recently that the  
 185 models here, and the Lindemann form of the pressure de-  
 186 pendence of the rate-constants for R<sub>5</sub> and R<sub>7</sub>, reduce the  
 187 accuracy of the explosion limits.<sup>6,14,27,30</sup> As is commonly  
 188 done in deriving explosion limits from mass-action rate  
 189 equations, our simulations neglect heat release, which can  
 190 also affect the location of the third explosion limit, and  
 191 treat systems as well-mixed. These conditions, however,  
 192 do not invalidate the proof-of-principle that explosion  
 193 limits emerge – and can be extracted – from stochastic  
 194 trajectories without mass-action rate equations.

### 195 C. Symbolic model for hydrogen oxidation

The second model<sup>14</sup> we consider is a symbolic model  
 that consists of six irreversible reactions:



196 The species R represents the reactants (e.g., H<sub>2</sub> and O<sub>2</sub>),  
 197 C and D are the low and high pressure radical chain carri-  
 198 ers (representing H, H<sub>2</sub>O<sub>2</sub>, and HO<sub>2</sub>), and P is the stable  
 199 product analogous to H<sub>2</sub>O. Reaction 1 is the chain initia-  
 200 tion step, which generates the first radical needed to be-  
 201 gin the branching process. Reaction 2 is the low-pressure  
 202 branching reaction, and Reaction 3 is the corresponding  
 203 gas-phase termination of the low pressure radical, C. Rea-  
 204 ction 4 represents the high pressure branching step for  
 205 the termination product of Reaction 3; branching from  
 206 species D only occurs at high pressures, so at intermedia-  
 207 te and low pressures, it is preferentially terminated on  
 208 the wall. Reactions 5 and 6 are the wall termination re-  
 209 actions for C and D, which are important in the first and  
 210 third explosions limits, respectively.

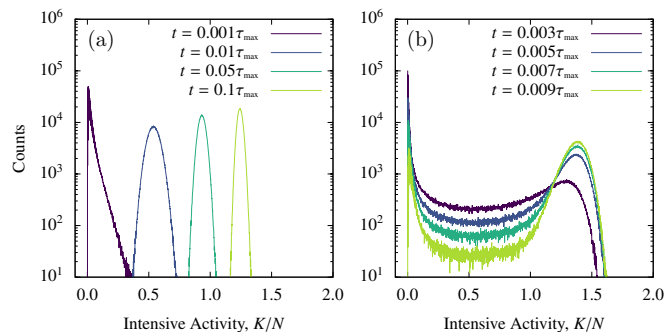


FIG. 1. Histograms of intensive activity for the symbolic model at a pressure of 100 Pascals and a temperature of (a) 740 Kelvin, below the explosion temperature, and (b) 760 Kelvin, above the explosion temperature. All histograms are from a sample of  $10^6$  trajectories. In (a), the distribution initially peaks at low activity and remains unimodal as time progresses. In (b), the distribution still initially peaks at a low activity but is transiently bimodal with equal peak heights at  $t^*$ . Both models exhibit the qualitative behavior illustrated by these histograms (with different temperatures and pressures marking the onset of bimodality).

211 Following Ref. [14], the rate coefficients for each re-  
 212 action are:  $k'_1 = 10^{-6}$ ,  $k'_2 = 10^5 e^{-9000/T}$ ,  $k'_3 = 1.0$ ,  
 213  $k'_4 = 10^5 e^{-16000/T}$ , and  $k'_5 = k'_6 = 0.01$ , where  $T$  is  
 214 the temperature in Kelvin. Note that the second and  
 215 fourth rate constants are in a modified Arrhenius form to  
 216 model their temperature dependence. This form differs  
 217 slightly from the traditional equation because the nume-  
 218 rator inside the exponent is not an activation energy but  
 219 rather an activation temperature with units of Kelvin.  
 220 We do not use the Lindemann equation to account for the  
 221 pressure dependence of the symbolic reaction rate coeffi-  
 222 cients. However, the propensities are pressure dependent  
 223 through the volume term in the propensity for bimolecu-  
 224 lar and termolecular reactions. Reaction R'<sub>3</sub>, for example,  
 225 is termolecular and its propensity is proportional to the  
 226 square of the pressure. The propensities of bimolecular  
 227 reactions vary linearly with pressure.

## 228 III. RESULTS AND DISCUSSION

### 229 A. Bimodality of trajectory observables

230 During each trajectory, the initial reactants are turned  
 231 into intermediate chain carriers that terminate to form  
 232 product(s). To characterize these dynamical histories  
 233 through the space of compositions, we use the dynamical  
 234 activity,  $K$ . We define  $K = K[\mathbf{x}(t_{\text{obs}})]$  as the number of  
 235 reactions occurring in a mixture of  $N$  molecules (initially  
 236 at a pressure  $p$  and temperature  $T$  over an observation  
 237 time  $0 \leq t \leq t_{\text{obs}}$ ,  $K[\mathbf{x}(t_{\text{obs}})] = \sum_i \mathbb{1}(\Delta t_i)$ . The indicator  
 238 function  $\mathbb{1}(\Delta t_i) = 1$  if a reaction event occurs and is zero  
 239 otherwise. We divide  $t_{\text{obs}}$  uniformly into intervals,  $\Delta t$ ,  
 240 apply the indicator function in each, and sum over time

241 intervals to get the activity. In the transient combustion  
 242 reaction, the activity is not extensive in time; the activ-  
 243 ity grows over the course of a trajectory but reaches a  
 244 fixed value when the reaction is complete. This behavior  
 245 is also found in other irreversible hydrogen combustion  
 246 mechanisms.<sup>17</sup>

247 The temporal behavior of the activity reflects the un-  
 248 derlying chemistry and, so, depends on whether the  
 249 macroscopic conditions are above or below the explosion  
 250 limits. Below the explosion limits, intermediates termi-  
 251 nate soon after forming; the temporal profile of the cumu-  
 252 lative number of reactions – the activity,  $K$  – tends to  
 253 steadily increase in most trajectories until the reaction  
 254 is complete. The activity tends to grow more rapidly  
 255 at higher temperatures and pressures. Above the limits,  
 256 some intermediates (e.g., the radicals H, OH and HO<sub>2</sub>)  
 257 accumulate in significant quantities: the peak amounts,  
 258 specifically, are dependent on pressure and temperature.  
 259 Because of the proliferation of radicals, the activity un-  
 260 dergoes a rapid jump, indicating an (auto)ignition event.  
 261 By the end of the trajectories, the product(s) dominate  
 262 the mixture, reactions cease, and the activity plateaus.

263 The ensemble of trajectories characterizes the overall  
 264 reaction. From our sample of this ensemble, we find the  
 265 histograms of the activity are also dramatically differ-  
 266 ent above and below the explosion limits, as shown in  
 267 Fig. 1. Below the explosion limits, there is a single peak  
 268 in the activity distribution consistent with the slow burn-  
 269 ing of the mixture and the absence of ignition, Fig. 1a.  
 270 Above the explosion limits, however, the trajectory en-  
 271 semble exhibits the signatures of a transient dynamical  
 272 phase transition. These signatures appear in the inte-  
 273 grated activity of all the trajectories between 600 and  
 274 1000 Kelvin and  $10^1$  to  $2 \times 10^6$  Pascals for both the re-  
 275 duced model and the symbolic model. Above the three  
 276 explosion limits, a prominent feature of the activity dis-  
 277 tribution is the transient coexistence of two peaks. We  
 278 denote the time that these peak heights are equal as  $t^*$ ,  
 279 Fig. 1b. At times before or after  $t^*$ , the distribution may  
 280 be unimodal. In contrast, trajectory ensembles at tem-  
 281 perature and pressure outside the explosive conditions  
 282 never display bimodality at any time.

### 283 B. Coexistence of autoigniting and non-igniting 284 dynamical phases

285 We assign the trajectories associated with the two  
 286 peaks in the activity distribution to a dynamical phase.  
 287 Each phase corresponds roughly to the progress of the  
 288 overall reaction exhibited in that phase: there is an au-  
 289 toigniting “active” phase associated with the maximal  
 290 peak height at  $K_a = N\kappa_a$  and a slow burning “inac-  
 291 tive” phase associated with the lower activity peak at  
 292  $K_i = N\kappa_i$ . Here,  $\kappa_i$  and  $\kappa_a$  are the most probable ac-  
 293 tivity density (activity per molecule) for the active and  
 294 inactive phases. These two peaks in the activity distri-  
 295 bution reflect the transient bi-stability and coexistence

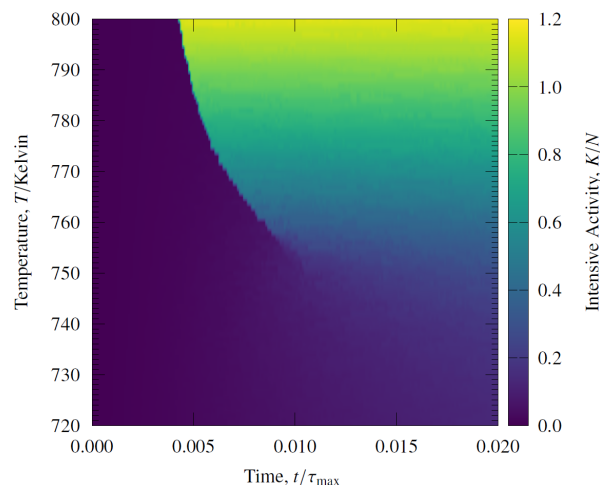


FIG. 2. Representative dynamical phase diagram for tem-  
 peratures near the first explosion limit for the symbolic hy-  
 drogen model at 100 Pascals ( $N = 10^3$  molecules initially).  
 The sharp boundary marks the coexistence of the inactive  
 and active phases at the characteristic time  $t^*$  when the inac-  
 tive and active peaks heights are equal. For a given pressure,  
 the pseudo-critical temperature (and time) is where the ac-  
 tive and inactive peaks are indistinguishable (approximately  
 750 Kelvin). The pseudo-critical temperatures coincide with  
 the explosion limit temperatures for each pressure. The re-  
 duced model has a qualitatively similar phase diagram (not  
 shown).

296 of two dynamical phases. A map of the coexistence of  
 297 these phases or “dynamical phase diagram” is shown in  
 298 Fig. 2 for conditions near the first explosion limit for the  
 299 symbolic model.

300 To understand the origin of the bistability, we sepa-  
 301 rately analyze the high and low activity trajectories.  
 302 First, each dynamical phase has a distinct composition  
 303 of chemical species and reactions for both models. For  
 304 example, mixtures at  $t^*$  that reside in low activity tra-  
 305 jectories are largely composed of reactants, H<sub>2</sub>/O<sub>2</sub> or R.  
 306 High activity trajectories, however, are composed mostly  
 307 of products, H<sub>2</sub>O or P. Second, the mole fractions of each  
 308 species in the active and inactive trajectories reflect the  
 309 frequency of reactions and overall progress of the reac-  
 310 tion. The low activity (inactive phase) trajectories are  
 311 dominated by termination reactions (R<sub>5</sub>, wall termina-  
 312 tions, R<sub>3</sub>, R<sub>5</sub>, and R<sub>6</sub>) that annihilate radicals, while the  
 313 high activity (active phase) trajectories are dominated by  
 314 branching reactions (R<sub>3</sub>, R<sub>4</sub>, R<sub>6</sub>, R<sub>7</sub>, R<sub>2</sub>, and R<sub>4</sub>) that  
 315 create radicals and water.

316 The unique time  $t^*$  at which dynamical phases coexist  
 317 depends strongly on pressure and temperature. Using  
 318 temperature, pressure, and time as control variables, we  
 319 map the most probable activity per molecule,  $K/N$ . The  
 320 resulting phase diagram in Fig. 2 shows a jump from  
 321  $\kappa_i$  to  $\kappa_a$  in the most probable activity per molecule at  
 322  $t^*$ . Because the long-time limit of the activity is linearly  
 323 extensive in the number of molecules, the density  $K/N$   
 324 has an approximate range of  $[0, 2.0]$ . Just above the phase

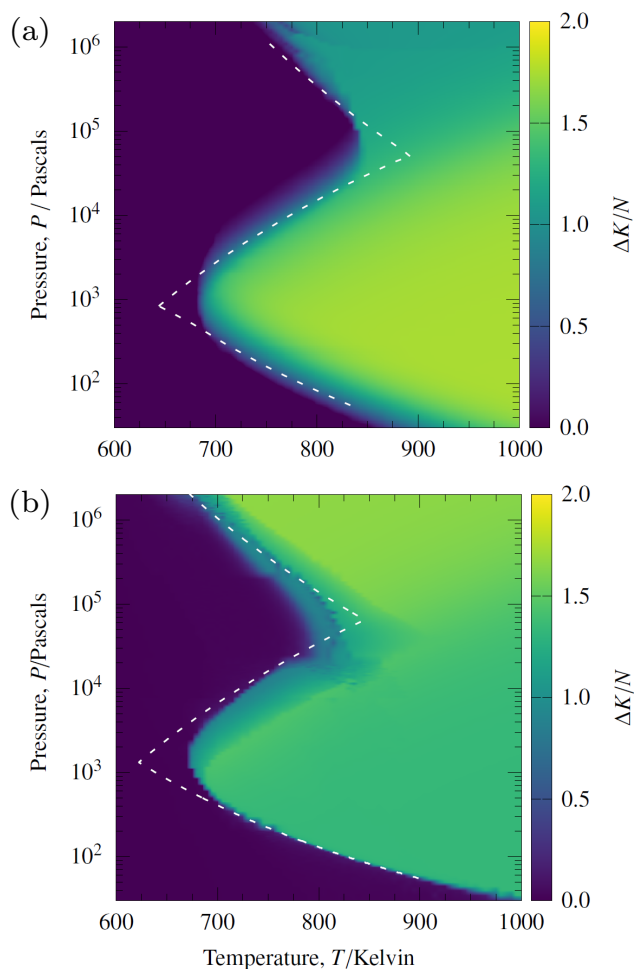


FIG. 3. A map of  $\Delta K/N$  at  $t^*$  in temperature-pressure space shows the “Z-shaped” explosion limits for the (a) symbolic and (b) reduced models. On the high temperature side of the explosion boundary, two dynamical phases will coexist transiently. For a given pressure, the lowest temperature with a measurable difference between activity peak heights,  $\Delta K/N = \kappa_a - \kappa_i$ , is approximately the pseudo-critical temperature,  $T_c(N)$ . Over the range of pressures here, the family of pseudo-critical temperatures agrees well with the asymptotic explosion limits (dashed lines) and marks the thermodynamic conditions where mixtures can ignite.

boundary, >95% of trajectories are in the active phase, and just below the boundary, >95% of trajectories are in the inactive phase. Crossing the coexistence boundary by increasing time or temperature causes a switch in the most abundant dynamical phase from inactive to active.

Along the phase boundary, the active and inactive peaks are of equal height. A similar diagram results, however, using the “equal area rule”.<sup>31</sup> Moving along the coexistence line in the direction of increasing time, the distance between the peak heights,  $\Delta K = K_a - K_i$  at  $t^*$  measures the activity change that accompanies the sudden burst of reactions upon ignition. We show the separation between activity peaks in Fig. 3 for the two models across all simulated  $T$  and  $p$ . This quantity measures the

“latent activity” associated with the transformation of a gaseous mixture over a small time window. The magnitude of  $\Delta K$  depends on the dominant reactive pathway, unique to each model and, within the model, depends on the reactions taking place at each limit. In essence,  $\Delta K$  is a measure of the difference in the progress of the overall reaction between the inactive and active trajectories.

The magnitude of  $\Delta K$  is zero when only one peak exists in the temporal profile of the activity; otherwise, there is a second activity peak and  $\Delta K > 0$ . The difference in activity  $\Delta K$  between the two phases shrinks moving down the coexistence line. Ultimately,  $\Delta K \rightarrow 0$  and vanishes at the pseudo-critical point, the time-temperature point corresponding to the loss of bimodality in the activity distribution. The temperature corresponds to the previously reported explosion limit temperature for both of these models.<sup>14</sup> From a visual inspection of the reaction counts, trajectories below the critical point exhibit reaction patterns with repeated initiation and termination, which prevents sustained branching and the growth of the radical pool. Above the critical temperature at a given pressure, the evolution of trajectories transitions from repeated initiation and termination to having periods of sustained branching and propagation. The low activity trajectories have a long ignition delay as a result of frequent termination reactions and the high activity trajectories undergo a large jump in activity over a short amount of time as a result of sustained branching.

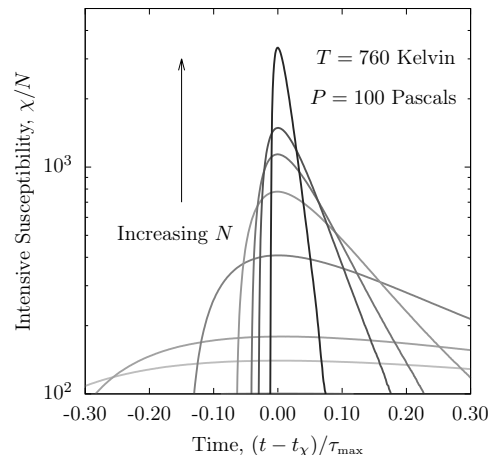


FIG. 4. The intensive susceptibility,  $\chi(t)/N$ , as a function of time. Data shown are for  $10^6$  trajectories above the explosion limit at 100 Pascals and 760 Kelvin for the symbolic model; these data are representative of the behavior of both models above their respective explosion limits. The susceptibility concentrates around  $t_\chi$  upon increasing the initial number of molecules,  $N$ , in the mixture. The scaling of the statistical parameters of these data, such as the height and temporal location of the peak, correspond to those of a first-order phase transition above the explosion limit. For example, the maximum susceptibility scales as  $\mathcal{O}(N^2)$  above the explosion limit and as  $\mathcal{O}(N)$  below.

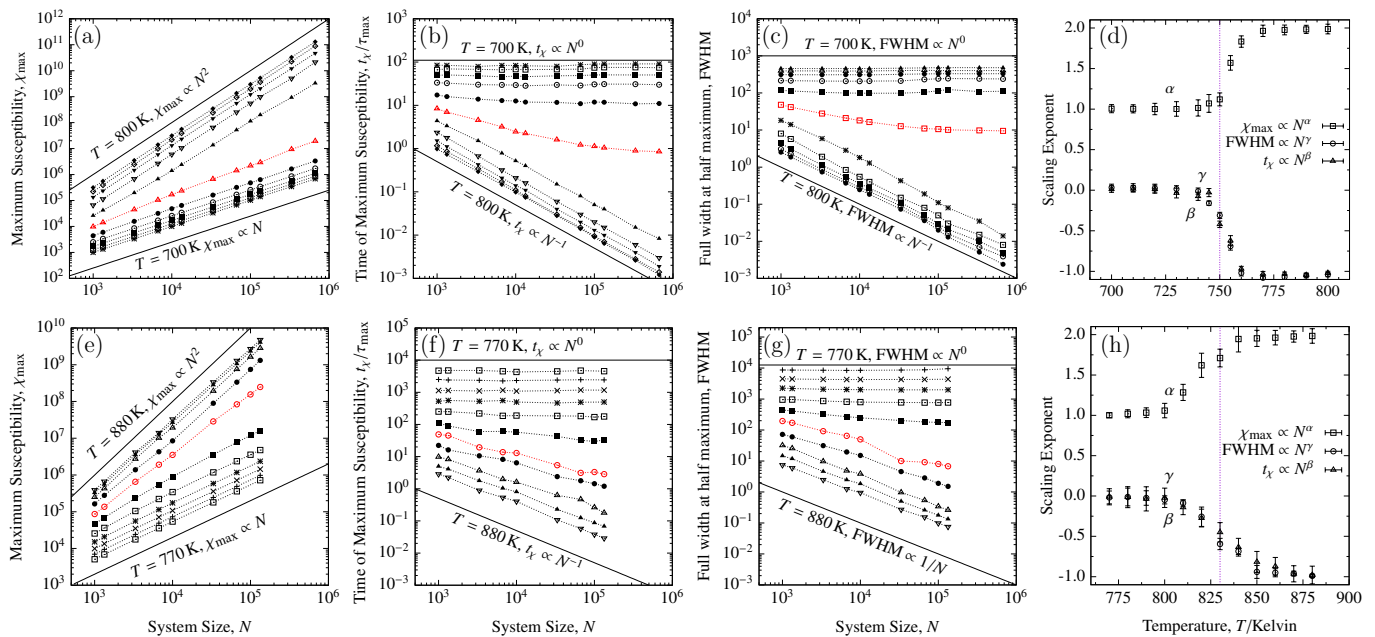


FIG. 5. Scaling of the susceptibility,  $\chi(t, N)$ , with the initial number of molecules ( $N$ , system size) for the symbolic (a-d) and reduced (e-h) models near the first explosion limit. The scaling of (a,e) the maximum susceptibility, (b,f) the temporal location of the maximum susceptibility, and (c,g) the full width of the susceptibility at half the maximum. The scaling behavior of these observables changes abruptly across the explosion temperature at 100 Pascals: 750 K for the symbolic model and 830 K for the reduced model; the scaling above the explosion limit is consistent with a first-order dynamical phase transition at  $t^*$  and  $T^*$  above  $T_c(N)$ . The scaling exponents exhibit a crossover (d) at 750 K for the symbolic and (h) at 830 K for the reduced model. These crossover temperatures are consistent with previously reported explosion limits at the first limit.<sup>14</sup>

367 The main result here is that the temperatures and 395  
 368 pressures where  $\Delta K$  becomes nonzero correspond to the 396  
 369 points on all three explosion limits for both the reduced 397  
 370 hydrogen and symbolic models. This result is apparent 398  
 371 in Fig 3, which shows  $\Delta K/N$  for ensembles of trajec- 399  
 372 tories over a range of temperature and pressure. It is 400  
 373 clear that these maps have the well-known “Z-shaped”. 401  
 374 For comparison, the asymptotic explosion limits are also 402  
 375 shown (dashed lines). They are conditions where the 403  
 376 rates of radical proliferation and termination are in bal- 404  
 377 ance. These macroscopic limits derive from the rate con- 405  
 378 stants for the key elementary reactions at each limit. For 406  
 379 example, the asymptotic limit for the second limit in the 407  
 380 reduced model is when  $2k_2/k_5 = [M]$ . When the rate of 408  
 381 radical branching through  $R_2$  is greater than its termi- 409  
 382 nation through  $R_5$ , the system will explode at intermedi- 410  
 383 ate pressures.<sup>14</sup> The asymptotic limits for the symbolic 411  
 384 model are  $k'_5/k'_2$ ,  $k'_2/k'_4$ , and  $k'_2/k'_3$  for the first, second, 412  
 385 and third limits, respectively. For the reduced mech- 413  
 386 anism, these limits are  $k_H/k_2$ ,  $2k_2/k_5$ ,  $k_{HO_2}/k_6$ , where 414  
 387  $k_{HO_2}$  and  $k_H$  are the rate coefficients for the wall termi- 415  
 388 nation reactions. The data in Fig 3 show that for both 416  
 389 models the boundaries identified through stochastic simu- 417  
 390 lations compare well to these asymptotic boundaries. 418  
 391 They also show that, while reactions in the symbolic 419  
 392 model do not have a Lindemann pressure dependence, 420  
 393 both models are in qualitative agreement with each other 421  
 394 and have three explosion boundaries.

### C. Finite-size scaling of activity fluctuations

396 As further evidence that explosion limits are dynamical 400  
 397 phase transitions, we analyze the finite-size scaling 401  
 398 of activity fluctuations.<sup>31,32</sup> For all systems, we analyze 402  
 399 the variance of the activity or susceptibility,  $\chi(t, N) = 403$   
 400  $\langle K^2 \rangle - \langle K \rangle^2$ , where  $\langle \dots \rangle$  indicates an average over tra- 404  
 401 jectories. The evolution of the susceptibility over time 405  
 402 depends on whether the temperature and pressure are 406  
 403 above or below the explosion limit. Above the explosion 407  
 404 limit, for example, the susceptibility in activity evolves 408  
 405 from zero (at the start of the reaction) through a max- 409  
 406 imum value (during ignition) before decaying to a fixed 410  
 407 value at long times (Fig. 4).

408 Several features of this peak in the susceptibility char- 411  
 409 acterize the dynamical phase transition: the maximum 412  
 410 susceptibility, time of maximum susceptibility, and the 413  
 411 full width at half maximum (FWHM). The scaling of 414  
 412 these features indicates whether there is one phase or 415  
 413 two coexisting phases. Fig. 5 shows their dependence 416  
 414 on system size,  $N$ , for temperatures above and below 417  
 415 the explosion temperatures for both models at 100 Pas- 418  
 416 cals in system sizes ranging from  $N = 10^3$  to  $10^6$ . As a 419  
 417 function of  $N$  and temperature, the maximum suscepti- 420  
 418 bility has a linear dependence on  $N$ ,  $\chi_{\max} = \mathcal{O}(N)$  be- 421  
 419 low the explosion temperature. This scaling is consistent 422  
 420 with the existence of a single phase and the unimodal- 423  
 421 ity of the activity distribution. However, upon crossing

the explosion temperature, the maximum susceptibility becomes proportional to the square of the system size,  $\chi_{\max} = \mathcal{O}(N^2)$ , indicating bimodality and the coexistence of two phases. Above the explosion temperature, the time of max susceptibility,  $t_\chi$  and the FWHM show the scaling we expect for a first order phase transition, analogous to that of water along the liquid-vapor coexistence line: the time of max susceptibility and the FWHM transition from being proportional to  $N^0$  below the critical temperature to  $N^{-1}$  above.

Fig. 5d shows the scaling exponent of these observables versus temperature to show their non-linear dependence on  $N$  upon passing through the critical point. Interestingly, the crossover in the finite-size scaling exponents is not particularly sharp. We also note that the scaling exponents of the symbolic model crossover more quickly across the explosion limits than the scaling exponents of the reduced model, which change slowly for  $t_\chi$  and FWHM. We have also analyzed the finite-size scaling for another reduced model of hydrogen oxidation near the second explosion limit.<sup>17</sup> From these three models, it appears the crossover sharpness depends on the model and that models with fewer competing reactions seem to produce a sharper crossover. This effect could be statistical in origin, since models with fewer possible reaction paths must necessarily have less variation in their composition of reactions. More work is necessary to establish this observation, however.

The model here, and the nonequilibrium phase transition it exhibits, is similar to the branching process<sup>33</sup> in that it lacks spatial degrees of freedom and, therefore, does not have a correlation length.<sup>34</sup> At equilibrium, there are quantities that diverge at the critical point. In these zero-dimensional models for hydrogen combustion, while there is no correlation length, the branching time does diverge. At the explosion limits, the characteristic branching time diverges because  $t_B = 1/(k_3 - k_5[M])$ . The denominator here is the condition for the asymptotic explosion limits, which must be equal to zero along the asymptotic lines.<sup>8,14</sup> Since the characteristic time to produce radicals diverges, it is then reasonable to expect that the ignition-delay time would also diverge as a result of the balance of branching and termination rates at the asymptotic explosion limits.<sup>35</sup>

#### IV. CONCLUSIONS

To summarize, the trajectory ensembles of reacting hydrogen systems exhibits two dynamical phases at and above all three of the explosion limits of two models for chemically-driven explosions; below these limits, the trajectory ensemble has a unimodal activity distribution. The coexistence of these two phases and the scaling of the activity fluctuations above the critical temperature and pressure show that the dynamical phase transition is first order. From the temperature-time dynamical phase diagrams, the coexistence of these two phases terminates at a pseudo-critical point – the lowest temperature where these phases are distinguishable. The family of these critical points over a range of pressure is the well-known “Z-shaped” explosion diagram known for hydrogen combustion in chemical kinetics. It remains to be seen whether explosion limits of other fuels might also be recovered through this methodology. Looking ahead, it would also be of interest to model the energy released as heat during the reaction and increase the accuracy of the third explosion limit predicted by the models we adopted here. Furthermore, the method of mapping explosion limit boundaries from nonequilibrium pseudo-critical points is independent of the commonly used mass-action rate theories and so, in principle, could lead to the determination of explosion boundaries from molecular dynamics simulations.<sup>29</sup>

#### V. ACKNOWLEDGEMENTS

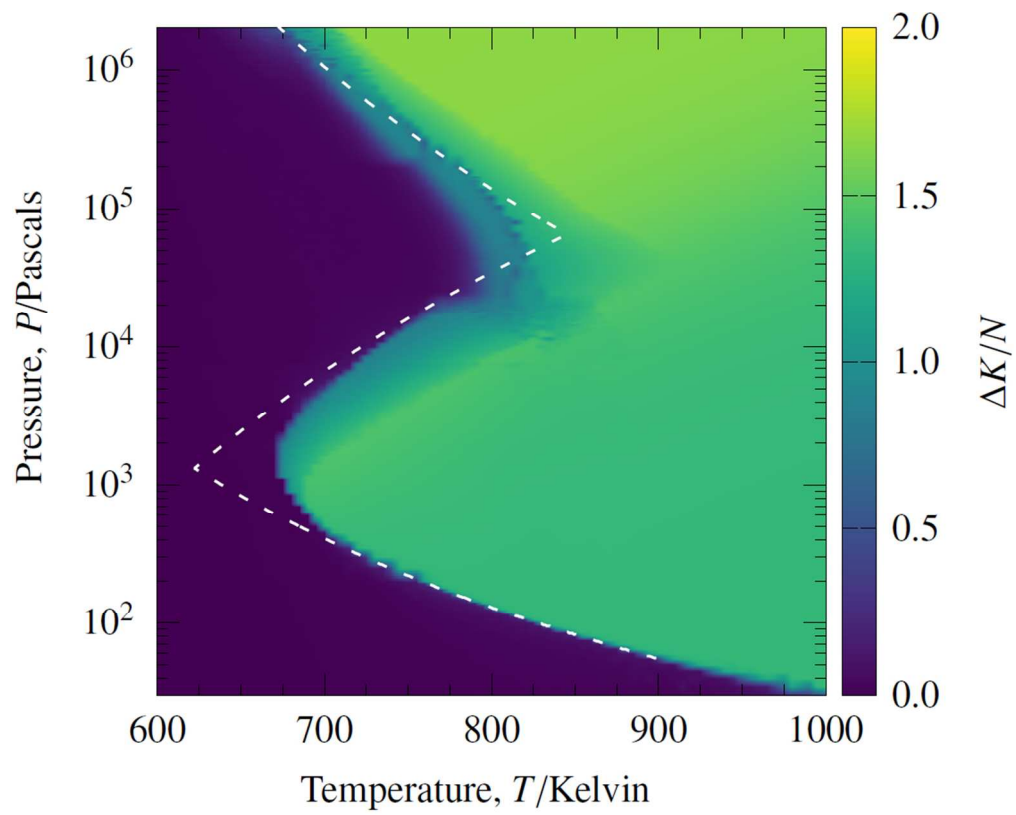
This material is based upon work supported by the U.S. Army Research Laboratory and the U.S. Army Research Office under grant number W911NF-14-1-0359. We acknowledge the use of the supercomputing facilities managed by the Research Computing Group at the University of Massachusetts Boston as well as the University of Massachusetts Green High Performance Computing Cluster. L.B.N. acknowledges the Oracle Education Foundation for a Doctoral Research Fellowship. The authors thank Dr. Moupriya Das and Rebecca A. Bone for comments on the manuscript.

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All three explosion limits of hydrogen oxidation are nonequilibrium critical points that terminate the coexistence of slow-burning and autoigniting dynamical phases.



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