## High-Resolution Post-Earthquake Recovery Simulation: Impact of Safety Cordons

Earthquake Spectra XX(X):2–31 ©The Author(s) 2022 Reprints and permission: sagepub.co.uk/journalsPermissions.nav DOI: 10.1177/87552930221075364 www.sagepub.com/



<sup>2</sup> Anne M. Hulsey,<sup>1</sup> M.EERI, Jack W. Baker,<sup>2</sup> M.EERI, and Gregory <sup>3</sup> G. Deierlein,<sup>2</sup> M.EERI

#### Abstract

4

5

1

A framework is proposed to assess the impact of safety cordons on the recovery of community functions after an earthquake, using high-resolution geospatial information to simulate the damage, cordons, and recovery trajectories for buildings in the affected area. Ground motion maps are developed to characterize shaking intensities for regional building-level engineering assessments of damage, repair times, and recovery times to quantify the impact of access restrictions associated with cordons around tall buildings with impaired collapse safety. The results are presented as recovery curves that quantify the cumulative loss in building functionality across the community as a function of time following an earthquake. A case study considers recovery of office space in downtown San Francisco, following a  $M_w 7.2$  event on the San Andreas Fault. For this scenario, an average of 219 community days of office functionality are lost in the first year, representing about 60% of the total office space capacity. About one-third of the loss is attributed to access restrictions associated with cordons around older tall buildings. The proposed framework can be used to investigate the efficacy of various mitigation strategies to expedite recovery. While the most effective strategy for mitigating the overall impact of cordon restrictions is to seismically retrofit older tall buildings that trigger cordons, other less expensive preparedness measures are shown to be effective, depending on the recovery time frame of interest. Specifically, recovery preparedness measures are generally more effective when evaluated for longer-term recovery targets (e.g., recovery of function after 12 months) as compared to short-term targets (e.g., recovery after 4 months).

#### Keywords

Post-earthquake safety cordons, building functional recovery time, community resilience, recovery targets, mitigation strategies, San Francisco, FEMA P-58, REDi, regional ground motion simulation

## 6 Introduction

A key component of community resilience is the ability to recover critical community 7 functions after a large earthquake. The U.S. federal government's Community Resilience 8 Planning Guide for Buildings and Infrastructure Systems (NIST 2016) cites several 9 categories of community capital (e.g. the financial, built, social, cultural capitals, etc.), 10 while focusing on the built environment's role in supporting the other types of capital. 11 For example, a functioning built environment would allow residents to stay in their 12 homes, grocery stores to provide access to food, and governments to coordinate the 13 recovery efforts. The Planning Guide describes how communities can identify their 14 critical functions, set recovery time targets for various hazard levels, and assess the 15 gap between the anticipated and the desired performance. This conceptual framework of 16 pairing community functions with associated time targets was pioneered in The Resilient 17 City: Defining What San Francisco Needs From its Seismic Mitigation Policies (SPUR 18 2009). Figure 1a shows a subset of the *Resilient City*'s recovery targets (blue diamonds) 19 and the anticipated performance (black Xs), highlighting the gap between the city's 20 resilience goals and the status quo. 21



Figure 1. (a) Examples of the target (blue diamonds) versus expected (black X's) recovery time frames for San Francisco's community functions (adapted from SPUR 2009).
(b) Duration of access restrictions in the Central Business District (CBD) due to cordons after the 2011 Christchurch earthquake, shown in relation to the five tallest buildings (17 to 23 stories), three of which were eventually demolished. Geospatial data from CERA (2016).

<sup>2</sup> Department of Civil and Environmental Engineering, Stanford University, Stanford, CA, USA

Corresponding author: Anne Hulsey: anne.hulsey@auckland.ac.nz

<sup>&</sup>lt;sup>1</sup> Department of Civil and Environmental Engineering, The University of Auckland, Auckland, New Zealand

When considering the performance of a dense urban downtown area, it is important to 22 recognize the potential for widespread access restrictions due to post-earthquake safety 23 cordons (hereafter, cordons). Cordons restrict access into potentially dangerous zones, 24 preventing casualties in the event of an aftershock by inhibiting the zone's pre-earthquake 25 community functions (Shrestha et al. 2021). The February 2011 Canterbury earthquake 26 in Christchurch, New Zealand demonstrated the potential scale and political/legal 27 challenges of this issue, with cordons restricting access to the Central Business District 28 (CBD) for many months after the earthquake (Chang et al. 2014; Marquis et al. 29 2017; Underwood et al. 2020). The damage was so extensive that the initial cordons 30 encompassed the entire CBD (light pink in Figure 1b). The most prolonged access 31 restrictions (over two years, shown in dark red) were driven by heavily damaged 32 buildings with impaired collapse safety, requiring extensive repairs or demolition. 33 Cordons around damaged tall buildings were particularly disruptive, due to both the 34 larger "fall zone", which could be impacted by debris, and the logistics of stabilizing a 35 larger structure. (Note that Christchurch's tallest building was 87m tall, while 75m is the 36 lower bound for San Francisco's Tall Building Inventory.) (ATC-119 2018) In addition to 37 the direct impacts on building repairs and reconstruction, the cordon also affected other 38 recovery-related decisions, such as whether individual businesses would return to the 39 CBD or relocate entirely. 40

While the Christchurch CBD is the best documented example of cordons in a dense 41 urban area, similar situations have occurred after other earthquakes. Examples include 42 the city center in L'Aquila, Italy, cordoned following the earthquake in 2009 (Contreras 43 et al. 2014), and cordons around damaged buildings following the 1989 Loma Prieta, 44 2010 Maule, and 2017 Puebla-Morelos earthquakes (Shepard et al. 1990; Miranda 45 2020). While there are photographic and anecdotal reports of past cordons, there have 46 generally not been systematic efforts to document and map the cordon management. 47 For example, cordons were not mentioned in a comprehensive reconnaissance report 48 for the 2010 Maule earthquake (EERI 2010) or other detailed reports of damage to tall 49 buildings (Rojas et al. 2011; Naeim et al. 2011; Carpenter et al. 2011). However, some 50 of the buildings referenced are known to have had cordons, such as Torre O'Higgins in 51 Concepción (Miranda 2020). These examples point to a general lack of attention given 52 to cordons and their impact on recovery. 53

The long and unprecedented access restrictions in Christchurch demonstrate the 54 potential for cordons to significantly disrupt recovery in dense downtown areas. The 55 city of San Francisco has recognized this, highlighting the need for protocols and 56 procedures for establishing cordons around damaged buildings, as well as recovery 57 plans for individual tall buildings and the financial district as a whole (ATC-119 58 2018). Accordingly, post-earthquake recovery assessments and plans should consider 59 the impacts of cordons around buildings with impaired collapse safety, including 60 access restrictions for otherwise undamaged buildings and delayed repairs for those 61 that are damaged. In the absence of empirical evidence from past earthquakes, the 62 proposed framework combines performance-based earthquake engineering simulations 63 with modeling assumptions for how cordons may affect the neighboring buildings' 64

<sup>65</sup> functional recovery time. These assumptions can be refined as future earthquake
 <sup>66</sup> reconnaissance efforts collect new data on cordons.

The proposed framework relies on a systematic performance-based approach to 67 integrate building- and community-level assessments. The following sections outline 68 how the framework uses state of the art building-level assessment tools to quantify 69 community-level recovery over time. The results for individual buildings are integrated 70 into geospatial analyses of the community, considering both geographically distributed 71 ground shaking intensities and access restrictions around damaged tall buildings. Details 72 of the framework are described and demonstrated through a case study to illustrate how 73 the analyses can be used to evaluate the efficacy of various mitigation strategies for 74 achieving resilience targets. 75

## 76 Performance-Based Earthquake Engineering

Performance-Based Earthquake Engineering (PBEE) focuses on quantifying how a system (e.g. a building or a community) will perform during an earthquake. The PBEE framework captures a system's response and the associated consequences in distinct steps, with each conditioned on the previous: ground shaking, the system's physical response, damage, and consequences (Moehle and Deierlein 2004). The following sections describe this process at the community- and building-levels, highlighting features that will be used in the proposed framework.

## <sup>84</sup> Community-level PBEE

A community performance assessment begins with the built environment's response to 85 ground shaking. Whereas assessments for individual assets only consider the shaking 86 at a single location, a community assessment must incorporate the shaking that occurs 87 across the region. This is often based on a scenario earthquake, using a map of 88 ground motion intensities at geographically distributed sites. For example, the recent 89 HayWired Scenario (Wein and Detweiler 2018) evaluated how the San Francisco Bay 90 Area may be affected by ground motion intensities that were based on one simulated 91 realization of a  $M_w 7.0$  earthquake on the Hayward Fault. While single earthquake 92 realizations can be useful to illustrate and raise awareness of what may happen to a 93 community, a single realization does not capture the range of potential results, which 94 is important for more rigorous planning decisions (Wesson and Perkins 2001; Lee and 95 Kiremidjian 2007; Adachi and Ellingwood 2009; Jayaram and Baker 2010). Therefore, 96 the proposed framework employs a suite of ground motion maps, considering multiple 97 earthquake realizations, to account for the uncertainty in shaking intensities that may be 98 experienced due to a scenario earthquake. It is possible to further extend the analyses to 99 probabilistically include many earthquake scenarios; however, in keeping with resilience 100 planning guidance, this framework focuses on recovery targets for distinct earthquake 101 scenarios, rather than the fully probabilistic hazard. 102

A second important feature of community-level PBEE is how the built environment is modeled. The built environment encompasses both buildings and infrastructure (NIST 2021), yet there are trade-offs in deciding which assets to consider in the model. Decisions regarding the model complexity and level of resolution will be informed by the type of questions the study aims to address. While the proposed framework can, in concept, include both buildings and infrastructure, this literature review and the ensuing case study focus only on modeling the community's buildings.

Many regional studies (including HayWired) rely on FEMA's Hazus software (FEMA 110 2012a) for estimating building repair cost, casualties, and population displacement across 111 a community. The Hazus methodology uses spatial aggregation to assess portfolios of 112 buildings, rather than each individual building. By creating a portfolio for each census 113 tract (based on the total number of buildings in each structural type and occupancy 114 category), the collective results can be based on the expected performance of simple, 115 generic building vulnerability models. While this level of resolution is useful for 116 aggregated data, such as the total building repair cost for the census tract, it cannot 117 capture the local impact of individual damaged buildings. 118

Cimellaro et al. (2018) used the generic Hazus building models at the individual 119 building resolution to consider the impact of building debris on access to roadways and 120 buildings. Their study employed Hazus models to estimate the volume of debris, based 121 on the building damage states, which was further assumed to affect the functionality 122 of nearby roads. Similar to the proposed framework, Cimellaro et al.'s study looked 123 beyond the simple aggregation of individual building performances by considering the 124 collective impacts that arise at the community level. However, Cimellaro et al.'s study 125 only considered the expected performance and relied on simplified assumptions for the 126 volume and impact of debris. In contrast, the proposed framework uses more detailed 127 building models to simulate the potential range of performance and identify damage 128 that would require a cordon around a building. Paired with ground motion maps to 129 quantify the variability in ground shaking, the proposed approach provides a distribution 130 of potential outcomes, ranging from cases with very few cordons to others with access 131 restrictions across most of the community. 132

Burton et al. (2016)'s community resilience assessment framework also used a 133 combination of multiple realizations of ground motions and detailed building models 134 to simulate building performance. Their study employed Monte Carlo simulation to 135 model realizations of community performance, sampling each building's functionality 136 state from fragility curves derived from component-level damage modeling. Burton et al. 137 (2017) subsequently applied the methodology in a case study of a residential community 138 in India, including the impact of recovery delays due to resource demand surge, based 139 on the number of buildings needing repairs (Comerio 2006). This secondary impact 140 of widespread damage highlights the importance of including the full variability when 141 assessing community performance. The proposed framework employs similar methods 142 for incorporating variability in building performance and recovery delays due to cordons. 143

## <sup>144</sup> Building-level PBEE

FEMA P-58 (FEMA 2012b) is a state of the art methodology for implementing PBEE
 at the individual building level, developed from previous efforts as reviewed by Mieler
 and Mitrani-Reiser (2018). The performance assessment simulates many realizations of

consequences (decision variables, DV) based on damage to structural and non-structural 148 components (damage measures, DM) that are distributed throughout the building. The 1/10 damage is based on the building response over the height of the building (engineering 150 demand parameters, EDP) conditioned on the level of shaking (intensity measure, IM). 151 This detailed, component-level simulation provides insight into the variability of the 152 consequences. For example, several research studies have quantified the relationship 153 between damage measures and increased probability of collapse, for the purpose of post-154 earthquake building evaluation (e.g., Raghunandan et al. 2015; Burton and Deierlein 155 2018; Hulsey 2020; Deierlein et al. 2020). Damage to tall buildings could endanger 156 pedestrians and neighboring buildings, due to both an increased probability of collapse 157 and damage to heavy exterior cladding that could fall from upper stories. The proposed 158 framework is designed to assess the likelihood of cordons based on each building's 159 simulated response and damage. 160

The REDi Rating System (Almufti and Willford 2013) builds on the FEMA P-58 161 methodology to provide refined estimates of building downtime. The cumulative repair 162 time is based on a logical repair sequence, considering the type of components that are 163 damaged (e.g., structural system, interior partitions, exterior cladding, etc.) and whether 164 the severity of damage would hinder re-occupancy, functional recovery, or full recovery. 165 In addition to calculating the repair time for each recovery state, REDi considers 166 so-called impeding factors that must be resolved before repairs can begin (Comerio 167 2006), including the estimated times required for damage inspection, financing (e.g. 168 collecting insurance payments or procuring loans), engineering design/permitting, and 169 contractor mobilization. (These impeding factors durations are sampled from probability 170 distributions, solicited via expert judgment for the United States, considering recovery 171 following a design level earthquake. Other hazard levels or locations may warrant 172 adjustments to these distributions.) According to REDi's impeding factor framework, 173 once the damage inspection is complete, the other three factors (financing, engineering 174 design/permitting, and contractor mobilization) are addressed in parallel, such that the 175 repairs are initiated as soon as the longest impeding factor is resolved. The proposed 176 framework extends REDi's impeding factor model to include the additional delays in 177 building repairs due to access restrictions associated with cordons. 178

# Integrating FEMA P-58 and Spatial Analysis of Cordons to Assess Building Functionality Throughout a Community

The proposed framework for assessing post-earthquake recovery of building functionality across a community is illustrated in Figure 2. The following sections provide an overview of each step in the process, details of which are described further in a case study application of the framework, presented later in the paper.

## <sup>185</sup> Community Functionality Model (Step 1)

Referring to Figure 2, the community functionality model describes the assets of
 the built environment that are necessary to support the desired community functions.



**Figure 2.** The primary steps of the proposed framework, with arrows denoting the flow of analysis and graphics illustrating key concepts at each step: (1) the community functionality model, (2) building vulnerability profiles and (3) ground motion maps for regional hazard are sampled to generate (4) realizations of each building's post-earthquake condition. The recovery process incorporates the (5) logistical impacts associated with building damage, impeding factors, and cordons. The suite of possible recovery trajectories for the community's functionality is distilled into summary (6) recovery metrics. These metrics can be used to evaluate (7) mitigation strategies that, in turn, influence the underlying community functionality model.

These functions typically relate to socioeconomic sectors, such as medical, educational, 188 government, business, or retail services. The community functions are then associated 180 with specific buildings in the community functionality model. Summaries of resilience 190 objectives (e.g., Figure 1a) typically focus on whether these buildings can support their 191 community services, such as the time until commercial office spaces re-open to support 192 their function after an earthquake (SPUR 2009; NIST 2016). The factors that can impact 193 building functionality will in turn determine which features are necessary to include in the 194 community functionality model. For example, if the assessment focuses on the influence 195 of building damage and cordon-related access restrictions on building functionality, then 196 an inventory of the buildings is sufficient for the community model. If the assessment also 197 considers closure due to loss of utilities or transportation access for employees to arrive 198 on site, the community model should include the utility and transportation networks. 199

#### 200 Vulnerability Profiles (Step 2)

The performance of each asset in the community functionality model is simulated 201 via vulnerability profiles that contain many realizations of decision variables, DV, 202 conditioned on a range of shaking intensities, IM. These stored realizations serve 203 as probability distributions, P(DV|IM). When considering building assets, each 204 vulnerability profile is derived from a full FEMA P-58 analysis of the building response. 205 component damage, and the resulting decision variables, i.e., the EDP, DM, and DV. 206 In the following case study, the DVs include the building repair time (considering both 207 the repairs required to restore functionality and, if necessary, the smaller subset of repairs 208 required to stabilize the building—as described later in the case study), triggers for 209 cordons, and triggers for other impeding factors. 210

Each building in the community inventory is associated with a unique vulnerability 211 profile, which may represent individual buildings or a class of buildings, such as low-rise, 212 concrete moment frame office buildings. Each profile is based on a building component 213 model for simulating damage and consequences, P(DV|DM)P(DM|EDP), and an 214 underlying building analysis model for the building response, P(EDP|IM). As each 215 vulnerability profile is modeled independently, the level of complexity for the building 216 analyses is flexible. This allows for applying detailed nonlinear response history analysis 217 for tall buildings, for which damage can have more severe consequences for the 218 community. In contrast, less influential buildings could be evaluated with simpler and less 219 computationally intensive models at the discretion of the modeler (e.g., simpler analysis 220 models for building response or Hazus-type building-level fragility functions). 221

## 222 Regional Hazard (Step 3)

Regional hazard is characterized by mapping realizations of ground motion shaking intensities, IM, for one or more earthquake scenarios. The maps reflect the variability in shaking intensities, including the spatial distribution of ground shaking across the region. The choice of intensity measures depends on the required input for the vulnerability profiles. Typically, the maps include spectral acceleration, Sa(T) at one or more periods, T, for each location, but other parameters such as shaking duration could be included.

Ground motion IMs are typically determined using ground motion prediction 229 equations, although direct simulations could also be used, similar to those in the 230 HayWired Scenario (Wein and Detweiler 2018). Ground motion prediction equations 231 provide the logarithmic means and standard deviations of spectral accelerations for a 232 given location, using predictor parameters such as rupture magnitude, distance from the 233 rupture, and site (near-surface soil) conditions. Related models quantify the spatial and 234 across-period correlations of the spectral accelerations, considering both the between-235 and within-event variability in shaking intensities. Together, these means, standard 236 deviations, and correlations are used to simulate a suite of unique realizations of ground 237 motion intensity maps that collectively represent the probability of shaking, P(IM), for 238 an earthquake scenario. 239

## <sup>240</sup> Condition of Individual Buildings (Step 4)

Once the building vulnerability profiles and ground motion maps are prepared, they are 241 used to sample the post-earthquake condition of each building in the community. For each 242 ground motion map realization, intensity measures, e.g., Sa(T), are sampled for each 243 building location, considering any building specific parameters, e.g., the fundamental 244 period, T. The intensity measure for each building is, in turn, used to sample a realization 245 of decision variables (repair time, repair cost, etc.) from each building's vulnerability 246 profile. For tall buildings, a cordon trigger index is also sampled. Depending on the 247 definition of the cordon trigger, it may reflect the building's impaired collapse safety, 248 damage to exterior cladding, or both. 249

Sampling many realizations of building conditions produces a full distribution of 250 the potential damage across the community. The collection of realizations, sampled 251 from the distributions for P(DV|IM) and P(IM), incorporates the uncertainty in 252 ground shaking intensity measures (via the ground motion maps) and in the decision 253 variables (via the vulnerability profiles). The individual building conditions for a given 254 ground motion map realization are sampled independently, however the ground motion 255 correlation does produce some correlation in building performance. By developing and 256 storing the building vulnerability data and ground shaking maps in separate, parallel 257 processes, any number of community realizations can be computed quickly for alternative 258 earthquake scenarios, without recomputing the building-specific FEMA P-58 analyses. 259

## Logistical Impacts (Step 5)

Having simulated the post-earthquake condition of individual buildings, the next step is to 261 evaluate the logistical delays in the subsequent recovery process, due to cordons and other 262 impeding factors. An impeding factor model is applied to each building to determine 263 when repairs can be initiated. The model includes both REDi's impeding factors for 264 individual building-level delays and the community-level impact of access restrictions 265 due to a cordon around a nearby building. The cordon occurrence and location depends 266 on the sampled condition of each tall building. If a cordon is triggered, it is assumed 267 to remain in place until the damaged building is stabilized (e.g., the structural system 268 and exterior cladding are repaired or the collapse/falling hazard is reduced via shoring). 269

The cordon duration is included in the impeding factor model for every neighboring building within the cordon. Both the duration and the extent of the cordon are informed by modeling assumptions, such as those applied in the case study described later. As procedures and protocols are developed for establishing and maintaining cordons, they can inform these assumptions (FEMA P-2055 2019). Once each building's impeding factor delay is evaluated, it is added to the functional repair time to obtain a total downtime for each building in the community.

## 277 Community Recovery Metrics (Step 6)

At this step, the downtimes of each individual building are aggregated to quantify the 278 community functionality over time after the earthquake (e.g., the percent of commercial 279 office space that is restored to its function). The number of buildings (and associated 280 office space) that have been restored to functionality is computed at discrete time steps 281 after the earthquake to create a recovery curve (Bruneau et al. 2003) for each realization. 282 The recovery curves for all the realizations represent the probability distribution of the 283 community performance. As illustrated in the case study presented in the next section, the 284 distribution of recovery curves can be distilled into an expected (i.e., average) recovery 285 curve, along with other scalar metrics of recovery. 286

## <sup>287</sup> Mitigation Strategies (Step 7)

The recovery metrics from the community assessment framework reveal the gap between the desired performance and the expected performance (Figure 1a). Strategies such as mandatory retrofits (to reduce damage by improving the building performance) or preparedness planning (to shorten the impeding factor durations) can mitigate the disruption due to the earthquake, reducing the gap. The community recovery metrics allow resilience planners to compare the various mitigation strategies based on multiple dimensions.

## <sup>295</sup> Illustrative Case Study: Downtown San Francisco

The proposed community recovery framework is applied to a case study to examine building damage and recovery in San Francisco's dense downtown area, considering the impact of cordons around damaged tall buildings on the recovery of neighboring buildings. The study illustrates details associated with implementing each step of the proposed framework, providing an example of how to address them. Finally, it culminates in a comparison of the relative benefits of mitigation efforts, such as preparedness planning or building retrofits.

## <sup>303</sup> Community Functionality Model (Step 1)

The case study focuses on one aspect of community functionality, specifically the functional office space available in the downtown financial district. Office space represents over half of the total building space in downtown San Francisco and one of the *Resilient City* recovery targets is to restore functionality for 50% of the office

space within four months of a design level earthquake (SPUR 2009, see Figure 1a, 308 above). Potential disruptions are defined here as damage to each individual building 300 or access restrictions due to cordons around tall buildings. Based on this definition, 310 a functional office building (NIST 2021) is one for which any building damage that 311 hindered functionality has been repaired and any cordon restrictions, which would 312 otherwise limit building access, have been lifted. Note that additional disruptions, 313 such as damage to utilities, transportation networks, or other externalities, could be 314 considered by including the relevant components of the built environment (e.g., electrical 315 substations and underground networks). While these disruptions have a significant impact 316 on functionality, they are outside the scope of this case study. Moreover, though it is 317 recognized that business recovery is contingent on the recovery of employees' residential 318 housing, this aspect is also outside the scope of the present study. 319

The community model encompasses the downtown region of San Francisco with a 320 dense population of tall buildings (Figure 3a). Of the 1078 buildings in the study area, 321 87 are taller than 75m, which is a "tall building" designation based on triggers in the 322 building code (ASCE/SEI 7-16 2016). The case study only considers cordons around 323 buildings taller than this height. Assuming that the cordon radius is equal to 1.5 times 324 the building height (per ATC-20-1 2015), the cordons typically extend over the length 325 of a city block or more from the damaged tall building. The inventory of buildings for 326 the study area was derived from tax assessor, land use, and LIDAR datasets available at 327 San Francisco's open source portal, dataSF.org. The building attributes include location, 328 year of construction, height, occupancy type, building area, and structural system (i.e., 329 the attributes that are required for creating the vulnerability profiles in Step 2). The 330 data required significant merging, cleaning, and assumptions, particularly for inferring 331 the structural system. As such, the inventory is a reasonable representation based on 332 publicly available data, rather than a reliable description of every building in downtown 333 San Francisco. (See Hulsey 2020, Appendix A for more details on the inventory.) The 334 office buildings in the downtown region are shown in red in Figure 3b. These 445 office 335 buildings comprise about 58% of the community's total building space, about half of 336 which is located in 60 tall buildings (over 75m). The rest of the space supports other 337 community functions such as residential (16%), retail (14%), and hospitality (8%). 338

In addition to the building attributes, the community functionality model also includes assumptions about the preparedness plans for each building. The baseline case assumes the same plans for all the buildings, specifically that (1) the funding mechanism for repairs is private bank loans and (2) there are no contracts with engineering firms or contractors to ensure quick mobilization after the earthquake. These assumptions will inform the recommended distributions for sampling the impeding factor durations in Step 5.

#### <sup>346</sup> Vulnerability Profiles (Step 2)

The vulnerability profiles, developed based on FEMA P-58 analyses for each building, were generated using the SP3 tool (https://sp3risk.com/). The tool infers the building strength, along with the first three periods and elastic mode shapes, based on building



**Figure 3.** Geographic extent of the case study and selected properties of the building inventory by (a) Building height, and (b) Building occupancy. Of the 1078 buildings in the region, 87 are over 75m tall and 445 are office buildings.

codes and typical design characteristics for a given structural system and year of 350 construction. The elastic response parameters are adjusted, based on SP3's large database 351 of response data for representative buildings, to generate expected drift and acceleration 352 responses (EDP) over the height of each building, as a function of  $Sa(T_1)$ , where  $T_1$ 353 is the first period (Cook et al. 2018). Building component models are also compiled 354 automatically, based on occupancy type, year of construction, and building dimensions. 355 The EDP and component models are then used to perform the FEMA P-58 evaluation 356 of building performance (Haselton 2018). 357

Each building in the inventory is associated with a unique vulnerability profile. 358 Buildings with similar numbers of stories and structural systems will have similar EDP 359 models but may have different component models based on the building function, total 360 area, or story height. These and other variations between buildings could potentially be 361 grouped together for one representative vulnerability profile; however, since the required 362 computational effort was not prohibitive, this study uses unique vulnerability profiles for 363 each building to avoid any assumptions required for consolidating the building inventory 364 into groups. 365

As illustrated in Figure 4, the vulnerability profiles store the FEMA P-58 realizations 366 for each building, representing the distribution of potential post-earthquake building 367 conditions. The black tick marks in the figure represent individual realizations that were 368 simulated at discrete shaking intensities, and the shaded regions represent probability 369 percentiles. Note that for some intensities, a large percentage of the realizations are 370 associated with building replacement, represented by coincident tick marks at the upper 371 bound of the plot. This may be due to building collapse, residual drifts that render the 372 building irreparable, or repair cost/times that exceed the equivalent resources required 373 for replacement. The prevalence of such replacement cases explains why, visually, the 374 cloud of tick marks appears to be inconsistent with the shaded percentile regions. Each 375

vulnerability profile includes 5000 realizations to ensure an adequate resolution for the
 1000 realizations of building damage that are sampled across the building inventory in
 Step 4 of the framework.

Each stored realization is characterized by the following decision variables: (a) the 379 duration of the repairs required to restore building functionality (Figure 4a), (b) indicators 380 of damage severity to inform the length of the impeding factor delays, and (c) repair cost 381 as a fraction of the building replacement cost (Figure 4b). The duration for repairs and 382 impeding factors are both based on REDi's functional recovery state, which corresponds 383 to functional recovery as defined in a recent NIST-FEMA report (NIST 2021). For 384 buildings over 75m tall, the realizations also include (d) a trigger for whether the building 385 damage warrants a cordon, and (e) the duration of the repairs required for stabilizing the 386 building. The stabilization duration is calculated as an alternate recovery state, similar to 387 REDi's re-occupancy recovery state, which only considers significant damage. However, 388 the stabilization recovery state is further limited to only include repairs of the structural 389 components and exterior cladding that could jeopardize the safety of those around the 390 building. The stabilization duration only applies if a cordon is triggered. Ideally, the 391 cordon trigger(s) would be specific to the structural system and type of exterior cladding. 392 Because the building-level decision variables are derived from a full FEMA P-58 analysis 393 of the damage to each component, it is possible to incorporate any number of damage 394 states or patterns as a cordon trigger (Hulsey 2020, Chapter 3). However, in the absence 395 of detailed analysis for evaluating cordon triggers for each structural system, this case 396 study uses peak story drift as an approximate cordon trigger for all tall buildings over 397 75m. For buildings built before 2000, the trigger threshold is a peak story drift ratio 398 greater than 2%. For buildings built after 2000, which are assumed to incorporate all 399 the current detailing requirements for ductility, such as those introduced for reinforced 400 concrete in the 1980s and for steel moment frames in the 1990s, the trigger threshold is 401 4% peak story drift. 402

## <sup>403</sup> Regional Hazard (Step 3)

This case study considers the earthquake scenario that is associated with the *Resilient City*'s recovery targets: a  $M_w$ 7.2 on the San Andreas Fault, close to San Francisco (see the map in the upper left of Figure 5). The framework requires many realizations of regional hazard ground motion maps with shaking intensities at a set of locations and a range of spectral acceleration periods.

Each realization, k, simulates unique response spectra at each site, j, according to the following model:

$$\ln Sa(T)_{k,j} = \mu_{\ln Sa(T)_j} + \delta B_k + \delta W_{k,j}$$
(1)

where  $\ln Sa(T)_{k,j}$  is the logarithm of spectral acceleration (the bold text denotes a vector of spectral accelerations at a range of periods). The response spectrum spans all the building periods represented in the inventory, i.e.,  $0 \le T \le 6s$ . The term  $\mu_{\ln Sa(T)_j}$ is the predicted logarithmic mean for the *j*th site, and  $\delta B_k$  and  $\delta W_{k,j}$  are the betweenand within-event residuals, quantifying the *k*th realization's deviation from the mean.



**Figure 4.** An example building vulnerability profile, containing realizations for the post-earthquake condition at a range of shaking intensities. Tick marks show individual realizations from FEMA P-58 analyses, and shading indicates percentiles of the distribution. (a) Duration of the repairs that are required for restoring building functionality (b) Repair cost, as a fraction of the building replacement cost.

<sup>416</sup> The residuals  $\delta B_k$  and  $\delta W_{k,j}$  are simulated from zero-mean Gaussian random variables <sup>417</sup> with standard deviations of  $\tau$  and  $\phi$ , respectively. For a given realization,  $\delta B_k$  is constant <sup>418</sup> for all sites, while  $\delta W_{k,j}$  varies with spatial correlation.

This case study uses the Chiou and Youngs (2014) ground motion prediction equation 419 to obtain the logarithmic means  $(\mu_{\ln Sa(T)_i})$  and standard deviations (between- and 420 within-event terms  $\tau$  and  $\phi$ ) that characterize the spectral accelerations at a particular 421 location. The predictions are a function of rupture magnitude and the closest distance 422 from the rupture to the site locations (approximately 13km for this case study). The 423 ground motion maps are simulated for discrete reference sites roughly 1km apart, which 424 is consistent with the spatial resolution of the ground motion prediction equation (i.e., at 425 this distance from the fault, 1km would not significantly influence the median predicted 426 intensity). The site locations are positioned to reflect the variation in soil conditions 427 across the region (measured via average shear wave velocity over the top 30m,  $V_{s30}$ ). 428 Ten reference sites are mapped in Figure 5. For three of the sites, the predicted median 429 response spectra  $(exp(\mu_{\ln Sa(T)_i}))$  and +/-1 standard deviation are displayed next to the 430 map, shown in black and gray dashed lines, respectively. 431

For each realization, k, the simulation procedure incorporates both across-period and 432 spatial correlations for the residuals. The between-event residual,  $\delta B_{k}$ , has across-period 433 correlation (among the periods, T, in the Sa(T) vector) but no spatial component, as 434 it is constant across all sites. The within-event residuals,  $\delta W_{k,j}$ , include both across-435 period and spatial (across-site) correlation, where sites that are close to each other are 436 more likely to experience similar shaking than sites that are farther apart. These residuals 437 are simulated using a computationally efficient correlation model (Markhvida et al. 438 2018), which takes seconds to generate residuals for 10,000 map realizations (more than 439



**Figure 5.** The components for simulating ground motion maps realizations, *k*, for a  $M_w 7.2$  earthquake on the San Andreas Fault (upper left): Sa(T) response spectra are simulated for reference soil sites, *j* (colored circles on the map). The response spectra represent the shaking intensity for any nearby building situated on the same site class. The black dashed lines in the response spectra plots on the right show the predicted medians (exponent of the logarithmic mean,  $\mu_{lnSa(T)j}$ ) for three reference sites, based on the location and soil condition ( $V_{s30}$ ). The simulated between-event residuals ( $\delta B_k$ , light gray in top right) incorporate across-period correlation and are consistent across all sites. The within-event residuals ( $\delta W_{k,j}$ , the three darker gray plots) vary at each site and include both spatial and across-period correlations. Summing the mean and both residuals produces a response spectrum at each reference site, resulting in a single ground motion map realization. Visually, the gray solid lines in the spectral plots show (the exponent of)  $\mu_{lnSa(T)j} + \delta B_k$ , while the solid black lines also include the location specific  $\delta W_{k,j}$ .

sufficient for the 1000 community realizations that are used in Step 4). The simulated residuals are added to the logarithmic mean for each site to produce correlated response spectra, per Equation 1 and as shown in Figure 5's three site response spectra for one ground motion map realization. Together, the suite of ground motion maps collectively represent the estimated range of ground shaking in downtown San Francisco due to a  $M_w 7.2$  earthquake on the nearby segment of the San Andreas Fault.

## 446 Condition of Individual Buildings (Step 4)

The building vulnerability profiles and the ground motion map realizations are combined 447 to simulate the post-earthquake condition of each building. The case study includes 1000 448 community realizations, each based on one sampled ground motion map. For a given 449 ground motion map realization, every building is assigned a spectral acceleration, Sa(T), 450 based on its fundamental period, T, and the nearest reference site in the same soil class. A 451 realization of the building's condition is then sampled from the associated vulnerability 452 profile, given the assigned input intensity measure. The black tick marks in Figure 4 453 show the distribution of realizations for functional repair times and the associated repair 454 costs at each intensity level in the vulnerability profile. Given the similarity of adjacent 455 distributions, the building condition is sampled from the nearest intensity, rather than 456 interpolating between them. This avoids the challenge of correlated interpolation among 457 the five decision variables that are sampled for each realization, i.e., a vector that includes 458 the repair times and costs (shown in Figure 4), along with impeding factor indices and 459 cordon triggers. 460

One of the important considerations in establishing the functional recovery time for 461 buildings is determining the minimum damage threshold trigger for loss of functionality. 462 While the REDi methodology considers this in the definition of the repairs that are 463 required for the functional recovery state, REDi may overestimate the recovery time 464 by ignoring steps taken to accelerate recovery for buildings with low levels of damage. 465 While building closure typically results in long logistical delays (impeding factors) 466 before functionality is restored (Comerio 2006), there is evidence indicating that the 467 damage triggers for long-term building closure depend on the ingenuity of building 468 owners/managers to alleviate the impact of damage that is straightforward to repair 469 and does not require significant engineering interventions (Mitrani-Reiser et al. 2012; 470 Jacques et al. 2014). Recent work has explored the damage threshold for building closure 471 by differentiating between REDi's definition of the reoccupancy recovery state and 472 the less conservative "shelter-in-place" associated with temporarily reduced habitability 473 standards (Molina Hutt et al. 2021); however, this work is limited in scope to residential 474 occupancies. In the absence of established models to account for these factors for office 475 space, this case study assumes that a building with repair costs  $\leq 10\%$  of the building 476 replacement cost will remain functional after the earthquake, thereby alleviating the long 477 logistical delays associated with a full building closure. 478

Once the post-earthquake condition of every building has been sampled, the impact
of the cordons is evaluated. As noted previously, the number and location of cordons
is based on the triggering condition of the tall buildings. The cordon size is based on a

482

483

484

485

486

487

baseline assumption of a circular cordon with a radius equal to 1.5x the height of the building, as suggested in CALBO (2013) and ATC-20-1 (2015). The spatial analysis to determine which neighboring buildings are affected is based on the centroid of the building footprints. When a building is impacted by multiple overlapping cordons, the building access is restricted until the last remaining cordon is removed. Evaluating the cordon boundaries and the number of buildings that lie within the cordons for each realization of the community's post-earthquake condition provides a probabilistic

each realization of the community's post-earthquake condition provides a probabilistic 488 estimate of the number of buildings affected by cordons. As shown in Figure 6a, there 489 is a 50% chance of having at least 14 cordons or of having almost 400 buildings within 490 the cordoned area (shown by the dashed lines that extend from the  $50^{th}$  percentile of 491 the corresponding histograms). As shown in Figure 6b, the median number of cordons 492 (14) coincidentally results in a loss of about 50% of the office space. Note that the tall 493 buildings that require a cordon also lie within the cordon and are therefore counted among 494 the affected buildings. Due to the concentration of office space in the tall buildings, there 495 is a 25% chance that over 85% of the office space will be affected by cordons (referring 496 to the horizontal  $75^{th}$  percentile line in Figure 6b). 497



**Figure 6.** The number of cordons required due to damage to tall buildings (x-axis) and their impacts (y-axis). The points in the scatter plot show all the community realizations, with histograms at the top and right representing the marginal distributions. The black lines in the histograms correspond to the  $25^{th}$ ,  $50^{th}$ , and  $75^{th}$  percentiles. (a) Number of buildings affected by the cordons. (b) Percentage of office space affected by the cordons.

Figure 6 further demonstrates one of the benefits of using high-resolution simulation 498 to account for each building's spatial location and uncertain response. Each point in the 499 scatter plots represents a transparent link between the simulated tall building damage and 500 the resulting cordons for each community realization. For example, a realization with 501 more cordons could be traced to a ground motion map with more intense shaking than the 502 predicted median (perhaps due to a between-event residual,  $\delta B_k$ , that is high for the long 503 periods associated with tall buildings, as in Figure 5). Similarly, each building's sampled 504 decision variable metrics (e.g., repair time and cost in Figures 4a and 4b) summarize the 505

damage for a unique, internally consistent FEMA P-58 realization, rather than assuming
 a correlation model between fitted distributions of each metric.

## 508 Logistical Impacts (Step 5)

The logistical impacts (impeding factors) include both the delays due to the cordons and the conventional pre-repair delays from the REDi impeding factor framework. The duration of each cordon is the time it takes to stabilize the tall building that triggered it (see Step 2 for the description of this recovery state). Shown in Figure 7a is an example of how the cordon duration is calculated based on the stabilization repairs of a tall building that requires a cordon, and shown in Figure 7b is an example of neighboring buildings that are impacted by the cordon.

Referring to Figure 7a, for tall buildings that require cordons, it is assumed that 516 the repair activity associated with removing the cordons can occur despite the access 517 restrictions. Therefore, the repair begins as soon as the initial inspection and the 518 parallel processes for financing, engineering/permitting, and contractor mobilization are 510 resolved. The durations of each impeding factor are sampled from REDi's suggested 520 distributions (see Table 8 in Almufti and Willford 2013), considering the amount of 521 damage, the building height, the financing mechanism, and preparedness plans for 522 securing engineers and contractors. The cordon is only necessary for the duration of the 523 stabilization repairs for the structural system and exterior cladding, which is one of the 524 metrics sampled from the vulnerability profile (see Step 2). Thus, for tall buildings that 525 trigger a cordon, the duration of the cordon (e.g., 40 weeks for the sampled realization in 526 Figure 7a) is calculated as the maximum impeding factor duration plus the stabilization 527 repair time, while the total recovery time (e.g., 53 weeks) includes the additional time for 528 the remaining functional recovery repairs. 529

As illustrated in Figure 7b, the cordon durations are included as impeding factors for 530 buildings within the cordon radius. Specifically, the cordon delay is treated as a fourth 531 parallel impeding factor that needs to be resolved prior to initiating repairs (see Hulsey 532 2020, Appendix C for a discussion of more complex interactions). A cordon that lasts 533 longer than the maximum impeding factor would induce additional downtime for the 534 building by postponing the initiation of repairs. This figure shows REDi's recommended 535 median impeding factor durations for a standard (non-high-rise) building with significant 536 damage, the baseline impeding factor assumption (no special preparedness plans), and 537 the 40-week cordon duration from Figure 7a. 538

Once the duration of each building's recovery phases (impeding factors, the cordon 539 delay, and repairs) have been established, they are aggregated to quantify the recovery of 540 the community's office space over time. Figure 8 represents one simulated community 541 realization with 14 cordons (which can be traced to one of the points on the vertical 542 line for the median number of cordons in Figure 6a). While Figure 6a demonstrated the 543 spatial impact of cordons immediately after the event, Figure 8 maps the recovery status 544 of each building in the community at 4 and 12 months after the earthquake. Blue buildings 545 are still waiting for their own impeding factors to be resolved prior to initiating repairs, 546 while repairs to the orange buildings are further delayed by the cordons. Once both the 547





**Figure 7.** Chart of the recovery activities for an individual building. **(a)** *A* damaged tall building that requires a cordon, where building stabilization repairs begin after the impeding factors are resolved. The cordon is removed after the building is stabilized, while additional repairs continue prior to reopening the building. (The durations of each impeding factor and the repair times are taken from a sampled realization for one of the tall buildings.) **(b)** *A neighboring building affected by the cordon*, where repairs are not initiated until the cordon is removed, even if the impeding factors have been resolved. (The durations depict REDi's recommended medians for significant damage to a non-high rise building that does not carry insurance or contracts with engineers or contractors, along with the cordon duration from 7a.)

<sup>548</sup> impeding factors and any cordons are resolved, the repairs are initiated (gray) until the <sup>549</sup> building functionality is restored (green). At 4 months, the recovery delays are dominated <sup>550</sup> by the conventional impeding factors. The impact of the cordons is more apparent at <sup>551</sup> 12 months, when the affected buildings' other impeding factors have been resolved yet <sup>552</sup> repairs cannot be initiated until the cordons are removed. (Note that Figure 8 shows <sup>553</sup> only one realization and does not quantify general patterns of cordoning, but serves to <sup>554</sup> illustrate the type of information that the approach provides.)



**Figure 8.** Maps of one recovery realization, showing the status of each building in the case study area at 4 months and 12 months after the earthquake. Blue buildings are still waiting for their own impeding factors to be resolved prior to initiating repairs, while orange buildings are further delayed by the cordons. Once both the impeding factors and any cordons are resolved, the repairs are initiated (gray) until the building functionality is restored (green). This realization includes 14 cordons (the median number across all realizations).

## 555 Community Recovery Metrics (Step 6)

While the community recovery can be mapped at discrete times for any one realization, 556 it is also useful to consider summary statistics for the full distribution of all the possible 557 recovery trajectories. A recovery curve depicts the community functionality over time, 558 with a functionality metric on the vertical axis and time on the horizontal. Figure 9a 559 shows a recovery curve for commercial office space within the downtown area, relative 560 to the pre-event capacity. Each gray line is one realization, showing how much of the total 561 available office space is still functional after the earthquake (the initial drop from 100%) 562 and how quickly it recovers over time. The area above each curve is equivalent to the total 563 loss of functionality for that realization (Bruneau et al. 2003). For clarity, the figure only 564 shows every 33rd realization, for a total of 30 of the case study's 1000 realizations. The 565 distribution of the realizations reflects the variability in both the ground motions and the 566 building vulnerabilities that are incorporated within the analysis. As shown in Figure 9a 567 the variability is significant, where the initial loss in office space ranges from nearly 0%568 to 100% for the scenario earthquake. To explore the relative impact of variability in the 569 ground motion maps versus the vulnerability profiles, the results are recomputed and 570 shown in Figure 9b based on the median predicted shaking intensity, i.e., with ground 571 motion variability removed. Comparing the results, the median recovery curves (dashed 572 lines in 9a and 9b) are similar, whereas the variability is much less. Due to differences in 573 the magnitude and skew of the probability distributions, the expected (average) recovery 574 curves are different. 575

The recovery curve realizations can be used to calculate scalar metrics to facilitate comparisons between assessment cases. One such metric is the functionality loss in the first year, which corresponds to the shaded gray region above the expected recovery



**Figure 9.** Community recovery metrics, based on recovery curves for the accessible office space over time. (a) Recovery metrics for the baseline case. The gray lines are a subset of the 1000 realizations in the case study. The solid black line shows the expected (average) functionality and the dashed line is the median. The shaded gray area above the expected functionality is the number of community days lost during the first year. The diamonds show the four and 12 month recovery targets for achieving 50% functionality. The percentage of realizations above each diamond represents the probability of achieving the target (35 and 46%, respectively). (b) Recovery curve realizations if the ground motion variability is not included (i.e., using the median predicted shaking intensity for each simulation). (c) Disaggregation of the expected community days lost, due to repair time only (gray), the impeding factors (blue), and cordons (orange). (d) Summary of metrics from 9a and 9c.

curves (solid lines) in Figures 9a and 9b, calculated over the first 365 days after the 579 earthquake. For the baseline results in Figure 9a, this equates to 219 community days 580 lost in the first year, which is almost two-thirds of the yearly capacity. For comparison, 581 the expected loss in Figure 9b, which does not include ground motion variability, 582 is 256 community days lost (about 16% higher). (An inverse analysis, not shown 583 here, considered ground motion variability in conjunction with each building's median 584 vulnerability. The resulting expected loss was 176 community days.) Another metric 585 is the probability of achieving a specified functionality level by a target date, such as 586 the Resilient City target of 50% functionality at 4 months after the earthquake, see 587 Figure 1a. Referring to 9a, 35% of the gray recovery curve realizations lie above the 588 light gray diamond, representing 50% functionality at 4 months, which corresponds 589

to a 35% probability of achieving this target. Extending the target to 12 months (dark 590 gray diamond) increases the probability of achieving the target to 46%. As shown in 501 Figure 9b, these metrics are drastically distorted when the ground motion uncertainty is 592 not accounted for, where the corresponding probabilities of achieving 50% functionality 593 would be 0% and 16% at 4 and 12 months, respectively. (For the inverse case with no 594 uncertainty in the building response, the percentage of functional office space would 595 still range from 0-100%, as in Figure 9a, but the 4 and 12 months probabilities of 50% 596 functionality increase to 53% and 62%, respectively.) 597

In Figure 9c, the expected (average) loss of office space is disaggregated into the 598 contributions from building repairs (gray area), conventional impeding factors (blue 599 area), and the cordons (orange area). Here, the recovery curve formed by the boundary 600 between the gray and blue areas considers only repair time, as though all repairs began 601 immediately after the earthquake. The curve between the blue and orange includes the 602 additional delays due to impeding factors, and the curve at the bottom of the orange 603 region includes delays due to cordons (equivalent to the solid black recovery curve in 604 Figure 9a). Using the colored areas, the expected number of community days lost in the 605 first year can be attributed to the underlying contributors. As summarized in the table in 606 Figure 9d, of the 219 community days lost in the first year, about 41% are attributed 607 to building repairs, 25% to conventional impeding factors, and 34% to the cordons. 608 The 50% recovery probabilities are also included in the table. Having established these 609 metrics, it is possible to compare the baseline case to any number of mitigation strategies 610 or sensitivity analyses, as in the next section. 611

## 612 Mitigation Strategies (Step 7)

A key motivation for developing the proposed framework is to inform resilience planning 613 by quantifying the anticipated recovery for the status quo and the effectiveness of 614 mitigation strategies to accelerate the recovery. Figure 10 includes an enumerated 615 list of the assessment cases considered. The baseline case (#1, as described in the 616 previous sections) includes no preparedness plans for mitigating the impeding factor 617 durations and a cordon radius of 1.5x the height of the building. Two sensitivity 618 studies (#2-3) demonstrate the impact of the cordons extents, either by neglecting the 619 cordons entirely or by reducing their radius to 1.0x the building height. Four cases 620 examine alternative preparedness measures for tall buildings (#4-7), including alleviating 621 the durations for contractor mobilization, engineering mobilization, financing, or all 622 three. The impeding factor parameters for the preparedness plans are per the REDi 623 recommendations (Table 1). (Note that while REDi also includes mitigation for the 624 inspection time, it is only the order of days, rather than weeks, so it is not included 625 here.) Another mitigation strategy (#8) focuses on employing seismic retrofits to reduce 626 the vulnerability of older (pre-2000) tall buildings. Two final sensitivity studies (#9-627 10) consider the impeding factor durations - reducing them by 50% for all buildings, 628 or eliminating impeding factor delays prior to the stabilization repairs for tall buildings 629 that trigger cordons. Figures 10a-d show the full downtime disaggregation for four cases, 630 while Figures 10e and f compare the scalar metrics for all ten. 631

**Table 1.** The impact of preparedness planning on the sampling distributions for the impedingfactor durations associated with financing, engineering mobilization, and contractormobilization. For brevity, the median and log standard deviation are only shown for cases withsignificant damage. (See Almufti and Willford 2013, Table 8 for additional values.)

Impeding Factor	Mitigation	Median (weeks)	Log standard deviation
Financing	Loans	15	0.68
	Insurance	6	1.11
Engineering	-	12	0.40
Mobilization	On contract	4	0.54
Contractor Mob.	-	40	0.31
(for $\geq 20$ stories)	On contract	7	0.35

The results indicate that cordons contribute significantly to downtime across the 632 community. As noted previously, in the baseline case (#1), 34% of the 219 community 633 days lost in the first year are attributed to the presence of cordons (Figure 10a and e). 634 As such, resilience planning efforts that do not consider the potential for cordons would 635 significantly over-estimate the probability of achieving the 4- and 12-month recovery 636 targets (see Figure 10f, case #2 versus #1). Case #3 considers the potential impact of 637 further research into debris patterns, which could help mitigate community losses by 638 supporting less conservative cordoning procedures. As seen by the disaggregation in 639 Figure 10b, reducing the cordon radius from 1.5x to 1.0x the height of the building 640 alleviates the number of undamaged buildings with access restrictions. Referring to 641 Figure 10e and f, case #3 versus #1, the change in radius results in a moderate reduction in 642 community days lost and improved probabilities for reaching the 50% occupancy targets. 643

One set of mitigation strategies is for tall building owners to undertake preparedness 644 plans for reducing the impeding factor durations. Reducing the impeding factors for the 645 tall buildings has two potential benefits: (1) any necessary stabilization repairs can be 646 initiated sooner, decreasing the duration of the cordon for the neighboring buildings and 647 (2) the functionality repairs are also addressed more quickly, restoring functionality to the 648 tall buildings that contain the majority of the community's office space. Figure 10c shows 649 the impact of adopting all of the preparedness measures (case #7). The results show that 650 the contractor mobilization (case #4) makes the greatest impact, although the aggregate 651 improvements in community days lost and the 4-month recovery probabilities are fairly 652 modest, even when all three measures are taken (compare case #7 to #1). This suggests 653 that damages always incur an impeding factor time cost that cannot be mitigated at the 654 4-month time scale. On the other hand, the combined mitigation measures are shown to 655 improve the probabilities of achieving the 12-month recovery target from about 46% to 656 about 58% (compare case #7 to #1 in Figure 10f). 657

A more aggressive and costly mitigation strategy is to retrofit the older (more vulnerable) tall buildings before an event (case #8), resulting in less initial loss of office space and fewer unstable buildings that require cordons (Figure 10d). The impact of retrofits are modeled by adjusting the building vulnerability profiles, using the same building attributes but revising the year of construction to reflect a building that satisfies



Figure 10. Comparisons of recovery metrics under the considered mitigation strategies:
(a) Expected recovery curves for the baseline assessment case. Gray represents the loss of function due to repair time, blue is the marginal loss due to impeding factors, and orange is the marginal loss due to cordons. (b) Smaller cordon extents reduce the loss due to cordons.
(c) Contingency planning mitigates the losses due to both impeding factors and cordons.
(d) Retrofitting the tall buildings mitigates the losses from all downtime contributions. (e) The horizontal bars show the expected community days lost in the first year, per downtime contribution. (f) The light and dark gray diamonds show the probability of achieving 50% functionality at four and twelve months, respectively.

modern (post-2000) design requirements. The vulnerabilities are updated for the 79 tall
buildings that were constructed before 2000 (out of a total of 87 tall buildings). As a
result, the retrofits reduce the median number of cordons required from 14 (in the baseline
case) to 2.

Based on the expected number of community days lost in the first year (Figure 10e), 667 the seismic retrofits (case #8) have a clear advantage over the baseline (case #1) and 888 other preparedness planning (case #7). Retrofitting reduces the loss by 66 community 669 days, whereas the combination of all three preparedness plans only mitigates 13 670 community days. Referring to Figure 10f, the tall building retrofit option provides 671 significant improvements in both the 4-month and 12-month targets, which are similar 672 to the sensitivity study for eliminating the cordons altogether (case #8 versus cases 673 #2 and #1). However, seismic retrofits are costly and take years to implement, while 674 mitigation strategies based on preparedness planning can be established relatively 675 quickly. Comparing the efficacy of preparedness plans versus seismic retrofit on the 12-676 month recovery probabilities (case #8 to #7 in Figure 10f), the retrofit still does better but 677 the difference is not as compelling as for the 4-month target or the community days lost. 678 Therefore, the perceived effectiveness of various mitigation strategies depends on the 679 recovery target time frame and the priorities of the decision makers. Any policy decisions 680 should consider the time and cost required to implement each option. 681

The final sensitivity studies probe the impact of reduced impeding factors, either 682 by reducing the impeding factor durations by 50% for all buildings or by eliminating 683 the impeding factors entirely prior to stabilization repairs for damaged tall buildings 684 (cases #9 and #10). As with the preparedness planning for tall buildings (case #7), 685 even a 50% reduction for impeding factor durations across all buildings (case #9) has 686 a negligible impact on the probability of achieving the 4-month recovery target (Figure 687 10e). Eliminating the impeding factors prior to stabilization repairs (case #10) provides 688 modest improvements, on the order of reducing the cordon radius to 1.0x the height of 689 the building (case #3). In contrast, the reductions are more effective at improving the 690 probabilities of achieving the 12-month recovery targets, almost to the level achieved 691 by the tall building retrofit (probabilities of 66% and 62% for cases #10 and #9 versus 692 73% for case #8). Eliminating the impeding factors for the stabilization of damaged tall 693 buildings is arguably among the most attractive options, since (1) it is less costly than 694 the retrofit option, (2) it is probably more feasible to deploy resources for stabilization 695 repairs on the cordoned buildings than to reduce the impeding factors and accelerate 696 functional repairs on all the tall buildings simultaneously, (3) it reduces disruption and 697 improves recovery trajectories of nearby buildings, and (4) the shorter stabilization 698 time would minimize access disruptions to nearby roads. However, the experiences 699 from Christchurch suggest that serious planning is needed to implement the strategy 700 of eliminating (or significantly reducing) impeding factors for stabilizing tall buildings. 701 For example, even when the Canterbury Earthquake Recovery Authority (CERA) was 702 authorized to make unilateral decisions for the sake of accelerating community recovery, 703 the process of stabilizing or demolishing buildings took on the order of eight months 704 (Tombleson et al. 2018). While the circumstances in New Zealand were unique, including 705 the local political/legal landscape and the impact of New Zealand's high insurance 706 penetration rates, the experience demonstrates that such coordination is possible but 707 would benefit from pre-event, community-level, interdisciplinary preparation. 708

#### 709 Conclusion

The proposed framework for assessing the recovery of community functionality is 710 intended to support seismic resilience planning for timely restoration of community 711 functions after an earthquake. By utilizing high-resolution (building-parcel resolution) 712 simulations with state of the art building performance models, the methodology allows 713 for assessing community recovery trajectories based on distinct features and mitigation 714 strategies at the individual building and community levels. In particular, the proposed 715 framework accounts for the impact of cordons around damaged buildings in a dense 716 downtown area, which can significantly affect the recovery trajectory. 717

The framework employs high-resolution post-earthquake recovery simulation, based 718 on building-level performance assessments (FEMA P-58 and REDi), to model the 719 impact of cordons on community recovery over time. The framework assesses building 720 vulnerabilities and ground motion maps independently, then integrates the two for 721 sampling multiple realizations of building damage and the required repairs. Once 722 the post-earthquake building conditions across the community are sampled for each 723 realization, the community functionality is tracked over time, considering the logistical 724 delays that impact each building. The impacts include both conventional impeding factors 725 for building repairs, such as the engineering/permitting process, and access restrictions 726 due to cordons around heavily damaged buildings. Finally, the recovery realizations are 727 distilled into community recovery metrics, including the expected number of community 728 days lost in the first year (which can also be disaggregated into the contributions from 729 cordons, impeding factors, or repairs) and the probability of achieving specified recovery 730 targets (e.g., recovery of 50% of office space within 4 or 12 months of an earthquake). 731

A case study demonstrated the application of the framework by considering the 732 functionality of office space in downtown San Francisco, following a  $M_w 7.2$  earthquake 733 on the San Andreas Fault. The results show that cordons are responsible for 75 734 (about one-third) of the expected 219 community days of office space lost in the first 735 year. This indicates the importance of considering potential cordons when developing 736 resilience plans and recovery targets. Sensitivity studies demonstrate the importance of 737 capturing the variability in recovery curves, considering uncertainties in both the ground 738 motion shaking intensity and the building vulnerability models. The community metrics 739 produced by this framework facilitate evaluations of various mitigation strategies such as 740 building retrofit mandates or preparedness planning to speed recovery. The metrics also 741 distinguish between strategies that are effective for achieving short-term versus longer-742 term recovery targets. In addition to the mitigation strategies, sensitivity studies are used 743 to examine which factors control the community recovery. This provides insight for areas 744 of further research and in developing other mitigation strategies. 745

The case study was intentionally simplified in some ways for the purpose of demonstrating the framework. Three priority areas for further refinement include: (1) including building-specific data (in contrast to the data compiled from tax assessor and land use data) for the tall buildings for improved structural analysis models that better reflect their nonlinear response to strong ground motions and damage indicator thresholds that correspond to increased collapse vulnerability and cordon triggering, (2)

improved models for logistical impacts on recovery times, including the impact of a 752 cordon on transportation systems, demand surge, and resource limits, and (3) the spatial 753 interaction between cordons, such as the impact of street patterns and the progression 754 of stabilization repairs throughout the restricted area (the importance of this feature 755 increases with the number of buildings that could require a cordon, as would occur if the 756 model considers cordons around buildings less than 75m tall). Other extensions could 757 be incorporated as research develops, such as considering liquefaction in the ground 758 motion maps and vulnerability profiles or incorporating correlations when sampling 759 building performance. Additionally, the practical application of the framework could 760 be enhanced by an interface for interrogating the simulated results, such as identifying 761 the cordon impact on critical functions (e.g., utility distribution centers or transportation 762 hubs) or creating table top exercises for examining recovery strategies (e.g., priorities 763 for building stabilization). However, even without such refinements and extensions, this 764 framework offers important insights into the potential for cordons and promotes a better 765 understanding of how to minimize their impact. 766

#### 767 Supplemental material

The Python packages used in this recovery simulation, *cranes* and *seaturtles*, can be installed from the Python Package Index (PyPI) with examples at github.com/annehulsey/cranes and /seaturtles. *cranes* implements the steps of the framework (Cordons in Recovery Assessments of Neighborhoods following Earthquake Simulations). *seaturtles* simulates ground motion maps (Scenario Earthquakes and the Uncertainty in Regional-Level Estimates of Shaking Intensities). The case study inputs and results are available at DesignSafe: doi:10.17603/ds2-dpam-dm40.

## 774 Acknowledgements

The first author would like to thank Adam Zsarnóczay for countless conversations on both the concepts of this framework and how to communicate them. Thanks also to Katie Wade of HBRisk and Wael Elhaddad of SimCenter for support in developing the vulnerability profiles and ground motion maps, respectively. Feedback from Francisco Galvis and Omar Issa enhanced the readability of this paper. This project was funded by Stanford University, the National Institute of Standards and Technology (NIST Award #70NANB17H245), and a FEMA graduate fellowship (awarded through the Earthquake Engineering Research Institute).

#### 782 References

- Adachi T and Ellingwood BR (2009) Serviceability assessment of a municipal water system under
   spatially correlated seismic intensities. *Computer-Aided Civil and Infrastructure Engineering* 24(4): 237–248. DOI:10.1111/j.1467-8667.2008.00583.x.
- Almufti I and Willford M (2013) REDi Rating System: Resilience-based Earthquake Design
   Initiative for the Next Generation of Buildings. Technical report, ARUP, San Francisco, CA.
- ASCE/SEI 7-16 (2016) Minimum Design Loads and Associated Criteria for Buildings and Other
- Structures. 7-16 edition. Reston, VA: American Society of Civil Engineers. ISBN 978-0-
- <sup>790</sup> 7844-0809-4. DOI:10.1061/9780784408094.

- ATC-119 (2018) San Francisco Tall Buildings Study. Technical report, Applied Technology
   Council, Redwood City, CA.
- ATC-20-1 (2015) Field Manual: Postearthquake Safety Evaluations of Buildings (2nd Edition).
   Technical report, Applied Technology Council, Redwood City, CA.

Bruneau M, Chang SE, Eguchi RT, Lee GC, O'Rourke TD, Reinhorn AM, Shinozuka M, Tierney
 K, Wallace WA and von Winterfeldt D (2003) A Framework to Quantitatively Assess and
 Enhance the Seismic Resilience of Communities. *Earthquake Spectra* 19(4): 733–752. DOI: 10.1193/1.1623497.

- Burton HV and Deierlein GG (2018) Integrating visual damage simulation, virtual inspection,
   and collapse capacity to evaluate post-earthquake structural safety of buildings. *Earthquake Engineering & Structural Dynamics* 47(2): 294–310. DOI:10.1002/eqe.2951.
- Burton HV, Deierlein GG, Lallemant D and Lin T (2016) Framework for Incorporating
   Probabilistic Building Performance in the Assessment of Community Seismic Resilience.
   *Journal of Structural Engineering* 142(8). DOI:0.1061/(ASCE)ST.1943-541X.0001321.
- Burton HV, Deierlein GG, Lallemant D and Singh Y (2017) Measuring the Impact of Enhanced
   Building Performance on the Seismic Resilience of a Residential Community. *Earthquake Spectra* 33(4): 1347–1367. DOI:10.1193/040916EQS057M.
- CALBO (2013) CALBO's Interim Guidance for Barricading, Cordoning, Emergency Evaluation
   and Stabilization of Buildings with Substantial Damage in Disasters. Technical report,
   California Association of Local Building Officials, San Francisco, California.
- Carpenter LD, Naeim F, Lew M, Youssef NF, Rojas F, Saragoni GR and Adaros MS (2011)
  Performance of tall buildings in Viña del Mar in the 27 February 2010 offshore Maule,
  Chile earthquake. *The Structural Design of Tall and Special Buildings* 20(1): 17–36. DOI: 10.1002/tal.672.
- CERA (2016) Public Geospatial Data: Christchurch Cordons Through Time. URL https: //ceraarchive.dpmc.govt.nz/documents/public-geospatial-data.
- <sup>817</sup> Chang SE, Taylor JE, Elwood KJ, Seville E, Brunsdon D and Gartner M (2014) Urban Disaster
   Recovery in Christchurch: The Central Business District Cordon and Other Critical Decisions.
   *Earthquake Spectra* 30(1): 513–532. DOI:10.1193/022413EQS050M.
- Chiou BSJ and Youngs RR (2014) Update of the Chiou and Youngs NGA Model for the Average
   Horizontal Component of Peak Ground Motion and Response Spectra. *Earthquake Spectra* 30(3): 1117–1153. DOI:10.1193/072813EQS219M.
- Cimellaro GP, Arcidiacono V and Reinhorn A (2018) Disaster Resilience Assessment of Building
   and Transportation System. *Journal of Earthquake Engineering* DOI:10.1080/13632469.2018.
   1531090.
- Comerio MC (2006) Estimating Downtime in Loss Modeling. *Earthquake Spectra* 22(2): 349–365.
   DOI:10.1193/1.2191017.
- <sup>828</sup> Contreras D, Blaschke T, Kienberger S and Zeil P (2014) Myths and realities about the recovery of
   L'Aquila after the earthquake. *International Journal of Disaster Risk Reduction* 8: 125–142.
   BOI:10.1016/j.ijdrr.2014.02.001.
- Cook D, Wade K, Haselton C, Baker JW and DeBock DJ (2018) A structural response prediction engine to support advanced seismic risk assessmeng. In: *11th U.S. National Conference on*

- 833 Earthquake Engineering. Los Angeles, California.
- <sup>834</sup> Deierlein GG, Yen WY, Hulsey AM, Galvis F, Baker JW and Hutt CM (2020) Safety of Tall Pre <sup>835</sup> Northridge Steel Frame Buildings and Implications on Cordoning and Recovery. In: 17th
   <sup>836</sup> World Conference on Earthquake Engineering, 17WCEE. Sendai, Japan.
- EERI (2010) 8.8 Chile Earthquake of February 27, 2010. Technical Report June, Earthquake Engineering Research Institute.
- FEMA (2012a) Hazus multi-hazard Loss estimation methodology, earthquake model, Hazus-MH
- 2.1 technical Manual. Technical report, Federal Emergency Management Agency, Mitigation
   Division, Washington, D.C.
- FEMA (2012b) Seismic performance assessment of buildings FEMA P-58-1. Technical Report
   September, Applied Technology Council, Washington, D.C.
- FEMA P-2055 (2019) Post-disaster Building Safety Evaluation Guidance Report on the Current
   State of Practice, including Recommendations Related to Structural and Nonstructural Safety
   and Habitability. Technical report, Applied Technology Council, Redwood City, CA.
- Haselton CB (2018) The SP3 Building-Specific Risk Model. SP3 Webinar Training Series URL
   https://vimeo.com/281330362.
- Hulsey AM (2020) The regional impact of post-earthquake safety decisions based on damage to
   tall buildings and elevated hazard due to aftershocks. PhD Thesis, Stanford University. URL
   https://purl.stanford.edu/nr843bk0882.
- Jacques CC, McIntosh J, Giovinazzi S, Kirsch TD, Wilson T and Mitrani-Reiser J (2014)
   Resilience of the canterbury hospital system to the 2011 Christchurch earthquake. *Earthquake Spectra* 30(1): 533–554. DOI:10.1193/032013EQS074M.
- Jayaram N and Baker JW (2010) Efficient sampling and data reduction techniques for probabilistic
   seismic lifeline risk assessment. *Earthquake Engineering & Structural Dynamics* 39: 1109–1131. DOI:10.1002/eqe.988.
- Lee R and Kiremidjian AS (2007) Uncertainty and correlation for loss assessment of spatially
   distributed systems. *Earthquake Spectra* 23(4): 753–770. DOI:10.1193/1.2791001.
- Markhvida M, Ceferino L and Baker JW (2018) Modeling spatially correlated spectral
   accelerations at multiple periods using principal component analysis and geostatistics.
   *Earthquake Engineering & Structural Dynamics* 47(5): 1107–1123. DOI:10.1002/eqe.3007.
- Marquis F, Kim JJ, Elwood KJ and Chang SE (2017) Understanding post-earthquake decisions
   on multi-storey concrete buildings in Christchurch, New Zealand. *Bulletin of Earthquake Engineering* 15(2): 731–758. DOI:10.1007/s10518-015-9772-8.
- Mieler M and Mitrani-Reiser J (2018) Review of the State of the Art in Assessing Earthquake Induced Loss of Functionality in Buildings. *Journal of Structural Engineering* 144(3):
   04017218. DOI:10.1061/(ASCE)ST.1943-541X.0001959.
- <sup>869</sup> Miranda E (2020) Personal communication, based on decades of earthquake reconnaissance trips.
- Mitrani-Reiser J, Mahoney M, Holmes WT, De La Llera JC, Bissell R and Kirsch TD (2012) A
   functional loss assessment of a hospital system in the Bío-Bío province. *Earthquake Spectra* 28(SUPPL.1): 473–502. DOI:10.1193/1.4000044.
- Moehle J and Deierlein GG (2004) A framework methodology for performance-based earthquake engineering. In: *13th World Conference on Earthquake Engineering*. Vancouver, B.C. Canada.

Molina Hutt C, Vahanvaty T and Kourehpaz P (2021) An analytical framework to assess earthquake-induced downtime and model recovery of buildings. *Earthquake Spectra* In Review.

Naeim F, Lew M, Carpenter LD, Youssef NF, Rojas F, Saragoni GR and Adaros MS (2011)
 Performance of tall buildings in Santiago, Chile during the 27 February 2010 offshore Maule,
 Chile earthquake. *The Structural Design of Tall and Special Buildings* 20(1): 1–16. DOI: 10.1002/tal.675.

- NIST (2016) Community Resilience Planning Guide for Buildings and Infrastructure Systems,
   Volume 1. In: *NIST Special Publication 1190-1*. National Institute of Standards and
   Technology. DOI:10.6028/NIST.SP.1190v1.
- NIST (2021) Recommended Options for Improving the Built Environment for Post-Earthquake
   Reoccupancy and Functional Recovery Time. In: *NIST-FEMA Special Publication FEMA P-2090/NIST SP-1254*, January. Gaithersburg, MD: National Institute of Standards and
   Technology. DOI:10.6028/NIST.SP.1254.
- Raghunandan M, Liel AB and Luco N (2015) Aftershock collapse vulnerability assessment of
   reinforced concrete frame structures. *Earthquake Engineering & Structural Dynamics* 44(3):
   419–439. DOI:10.1002/eqe.2478.
- Rojas F, Naeim F, Lew M, Carpenter LD, Youssef NF, Saragoni GR and Adaros MS (2011)
   Performance of tall buildings in Concepción during the 27 February 2010 moment magnitude
   8.8 offshore Maule, Chile earthquake. *The Structural Design of Tall and Special Buildings* 20(1): 37–64. DOI:10.1002/tal.674.
- Shepard RB, Wood PR, Berrill JB, Gillon NR, North PJ, Perry AK and Bent DP (1990) The Loma
   Prieta, California, Earthquake of October 17, 1989: Report of the NZNSEE Reconnaissance
   Team. Bulletin of the New Zealand Society for Earthquake Engineering 23(1). DOI: 10.5459/bnzsee.23.1.1-78.
- Shrestha S, Orchiston C, Elwood K, Johnston D and Becker J (2021) To cordon or not to
   cordon: The inherent complexities of post-earthquake cordoning learned from Christchurch
   and Wellington experiences. *Bulletin of the New Zealand Society for Earthquake Engineering* 54(1): 40–48. DOI:10.5459/bnzsee.54.1.40-48.
- SPUR (2009) The resilient city: defining what San Francisco needs from its seismic mitigation
   policies. Technical report, San Francisco Planning and Urban Research Association, San
   Francisco, CA. URL https://www.spur.org/publications/spur-report/
   2009-02-01/defining-resilience.
- Tombleson ZW, Yeow TZ, Khakurel S, Dhakal RP and Dawson CJ (2018) Quantifying downtime
   due to building demolitions in Christchurch. In: 2018 New Zealand Society for Earthquake
   Engineering.
- <sup>911</sup> Underwood G, Orchiston C and Shrestha SR (2020) Post-earthquake cordons and their <sup>912</sup> implications. *Earthquake Spectra* (May). DOI:10.1177/8755293020936293.
- Wein AM and Detweiler ST (2018) The HayWired Earthquake Scenario Engineering
   Implications Scientific Investigations Report 2017 5013 I Q. Technical report, U. S.
   Geological Survey. DOI:https://doi.org/10.3133/sir20175013v2.

Wesson RL and Perkins DM (2001) Spatial correlation of probabilistic earthquake ground motion
and loss. Bulletin of the Seismological Society of America 91(6): 1498–1515. DOI:
10.1785/0120000284.