



Candidate transmission survival genome of Mycobacterium tuberculosis

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Mycobacterium tuberculosis (Mtb), a leading cause of death from infection, completes its life cycle entirely in humans except for transmission through the air. To begin to understand how Mtb survives aerosolization, we mimicked liquid and atmospheric conditions experienced by Mtb before and after exhalation using a model aerosol fluid (MAF) based on the water-soluble, lipidic, and cellular constituents of necrotic tuberculosis lesions. MAF induced drug tolerance in Mtb, remodeled its transcriptome, and protected Mtb from dying in microdroplets desiccating in air. Yet survival was not passive: Mtb appeared to rely on hundreds of genes to survive conditions associated with transmission. Essential genes subserving proteostasis offered most protection. A large number of conventionally nonessential genes appeared to contribute as well, including genes encoding proteins that resemble antidesiccants. The candidate transmission survival genome of Mtb may offer opportunities to reduce transmission of tuberculosis.

Mycobacterium | tuberculosis | transmission | aerosol | biophysics

Mycobacterium tuberculosis (Mtb) is the cause of a multicentury bacterial pandemic that only occasionally yields to viral pandemics as the leading cause of human death from infection. While many pathogens of humans complete their life cycle in a reservoir other than the incidental human host, humans are Mtb's reservoir as well as its victims. In people who are not immunosuppressed, the case fatality rate for tuberculosis (TB) is about 70% for those who have microscopically detectable Mtb in their sputum and receive no treatment (1). For a pathogen that so readily kills its reservoir, transmission is an evolutionary bottleneck (2). However, whether any Mtb genes facilitate transmission is unknown. The transmission biology of Mtb (3) has been studied epidemiologically within populations (e.g., refs. 4–7), mechanistically by exposing experimental animals to patients' exhalations (e.g., ref. 8) and inferentially in studies that capture bacilli exhaled by people with TB (9-13). However, to our knowledge, there has been no preclinical model for studying the transmission biology of Mtb under physiologically relevant conditions at a genome-wide level.

The efficacy of TB treatment is monitored by tests on sputum. However, the typical viscosity of sputum (400 to 700 mPa•s) (14) limits its potential for fragmentation into large numbers of infectious aerosols that are small enough, typically postulated to be < ~5 μm in longest dimension (15-22), to stay suspended in laminar intrabronchial airflow, escape entrapment on the bronchial ciliary escalator and pass through the narrowest bronchioles to the pulmonary alveoli of a new host. Fluids of lower viscosity are likely to generate more respirable aerosols (20, 23). While diverse fragmentation processes may generate bacteria-laden respiratory particles (22, 24), the presence of necrotic pulmonary cavities correlates with infectivity (25). Cavity contents called "caseum" for their cheese-like viscosity routinely spill into bronchi (26), where they may be diluted by low-viscosity bronchial secretions. The rheologic properties of the resulting mixture may favor respirable microdroplet formation upon the shearing and bursting fluid fragmentation expected to occur during human tidal breathing, speech, song, and violent exhalations, such as coughs and sneezes (24).

Most preclinical studies of mycobacterial biology have involved laboratory media with markedly different compositions, buffers, and osmolarities than human body fluids, often under an atmosphere—room air—that is hyperoxic (O $_{\!2}$ ~ 21%) compared to most human tissues $(O_2 \sim 5\%)$ (27) and lacks carbon dioxide. CO_2 is the equilibrant that maintains the physiologic pH of the human bicarbonate buffer system, a key carbon source for Mtb's metabolism (28) and a sensitizer to oxidant injury (29). Moreover, transmission involves not one set of environmental conditions but sequential passage through a series of environments, in each of which survival of the bacilli may require shared or distinct mechanisms of adaptation.

Significance

Mycobacterium tuberculosis (Mtb) travels from the lungs of one person through the air to the lungs of another and survives multiple stresses en route, including changes in temperature and in concentrations of oxygen, carbon dioxide, hydrogen ions, salts, and organic solutes. Here, we present a genetically tractable model of transmission to begin the identification of the transmission survival genome of Mtb. We devised a fluid that mimics TB lesions, found that it protects Mtb from transmission-related stresses, associated this with the structure of the droplets as they dry and their ability to retain water, and used it to query the potential contribution of each of Mtb's genes to Mtb's survival in models of three sequential stages of transmission.

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Here, we present the introductory study in a series of efforts of increasing technical difficulty to identify the transmission survival genome of Mtb. Constrained by the equipment available for working at genome scale under biologic safety level 3 conditions, the present paper deals with 2-µL sessile droplets of Mtb. Given that the lessons learned may apply only in part to smaller droplets that are airborne, a forthcoming study based on newly designed devices will involve microdroplets suspended in air. A third study based on other new devices will test individual Mtb genes for their role in infecting mice via aerosol particles of defined size and number.

The present study models three stages of TB transmission in vitro (Fig. 1A): 1) residence of Mtb in a hypoxic, necrotic cavity closed off from the airways; 2) erosion of such a lesion into the airways, allowing for a higher level of oxygenation and mixture with bronchial secretions; and 3) expulsion into air in rapidly desiccating microdroplets. Incubation in the model aerosol fluid (MAF) described below mimicked residence in caseum in inducing phenotypic tolerance to several TB drugs (30). Two findings emerged. First, incubation in MAF substantially preserved Mtb's viability under conditions that model interhost transit in hyperoxic droplets whose evaporation cools and alkalinizes them as their solutes concentrate or precipitate. Second, Mtb appears to survive under these conditions by calling on large numbers of essential genes and on many genes deemed "nonessential" because their knockout, knockdown, or disruption by transposon insertion had not impaired Mtb's survival in studies under conventional conditions in vitro or in mice.

Results

Conditions Modeled. There may be diverse mechanisms of generation of infectious Mtb-laden respiratory microdroplets (24, 31). Here, we focused on one mechanism (Fig. 1A), beginning with Mtb's residence in the extracellular milieu of a necrotic lesion in the lung that does not communicate with an airway. In rabbits, such lesions had measured O₂ concentrations of 1.61 \pm 0.37 mm Hg (~0.2%) (33). When a necrotic lesion erodes into an airway, its aeration status may vary. Transthoracic needle aspiration revealed that the O2 concentration in human TB cavities averaged 17.8% for cavities called "open" (n = 7) and 13.6% in cavities called "partially closed" (n = 8) (34), but concentrations are likely lower in cavities that are too small for transthoracic aspiration and have smaller openings to an airway. We chose to model the open cavity O_2 concentration at 10%. For both closed and open cavities, we modeled relative humidity of 100% and the physiologic CO₂ concentration of 5%. To test thousands of individual microdroplets under biosafety level 3 (BSL3) conditions, we were limited to robotic equipment that dispensed 2 μ L volumes (diameter ≈ 1.56 mm) onto polystyrene surfaces, which were maintained in air (O₂ 21%, CO₂ 0.04%) at ≈22 °C. To emulate the rapidity of evaporation from smaller, aerosolized microdroplets, we applied a relative humidity of ≤ 5%. As they evaporate, the droplets cool (*SI Appendix*, Fig. S1*A*). As predicted, MAF alkalinizes in air (SI Appendix, Fig. S1B) as it loses CO₂ and its source, bicarbonate.

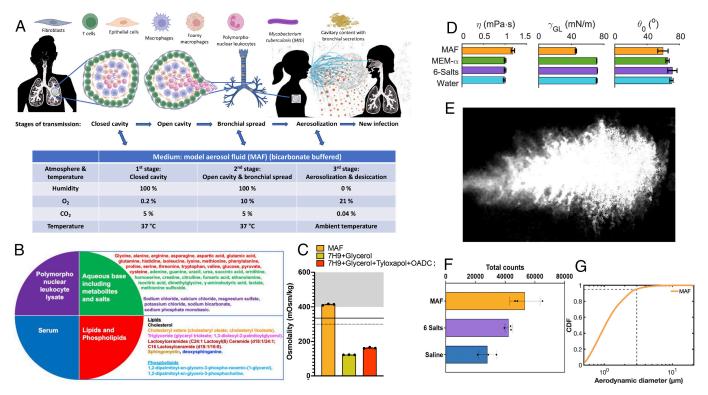


Fig. 1. Fluids and atmospheres modeling three stages of transmission. (*A*) Schematic. Part of the cartoon is adapted from Manna and Bourouiba in ref. 31. (*B*) Components of MAF. Organic metabolites present both in caseum and in Minimum Essential Medium-α (MEM-α) are in red. Those found in caseum but lacking in MEM-α are in green. Inorganic salts present in MEM-α are highlighted in purple, along with the organic compound bicarbonate, given its substantial contribution to the osmolality of MEM-α. Lipids are colored by class. Concentrations of each component are given in *SI Appendix*, Table S2 *A-F*. (*C*) Osmolality of MAF, 7H9 supplemented with glycerol and the latter further supplemented with tyloxapol, oleic acid, albumin, dextrose, and catalase at the standard concentrations listed in *SI Appendix*, Table S2 *A-F*. Means ± SEM for three measurements. The dotted line indicates the osmolality of MEM-α, which mimics human extracellular fluid. The solid line indicates values reported for mouse spleen and shaded area highlights values reported for BCG-infected mouse tissue (see text). (*D*) Dynamic viscosity η and surface tension γ_{GL} of MAF, MEM-α and its six major salts, and contact angle θ_0 of those fluids on a tissue culture-treated polystyrene surface were measured and compared to MilliQ deionized water. Density is reported in *SI Appendix*, Fig. S1D. Means ± SD for at least three measurements; individual values not shown where n > 10. (*E*) Cough cloud generated by the exhalation mimic system *ExhaleSimulator* (32) with a trajectory here shown to span 3 m from the source. (*F*) Total droplet counts within size range 0.5 to 20 μm, measured at 1 m from the source in (*E*). (*G*) Cumulative droplet size distribution of MAF particles counted in (*F*). Dashed lines indicate that ~94% were ≤3 μm in diameter.

Having designated atmospheres for each of the three stages (Fig. 1A), we turned to the composition of the MAF in which we suspended Mtb (Fig. 1*B*). Rabbit caseum contained 3 to 6 μg/mg cholesterol, ~2 μg/mg cholesteryl esters and 0.3 to 9 μg/mg triglycerides (35, 36). Marmoset caseum contained ~10 μg/mg cholesterol, \sim 5 µg/mg cholesteryl esters and 20 µg/mg triglycerides (35). In human caseum, the predominant triacylglycerides (TAG) were 52:1, 52:2, 52:3, 54:1, 54:2, 54:3, and 54:4 (35). We measured a mean of 70 ng/mL deoxysphinganine in caseum from four pulmonary TB lesions in three rabbits and 3 TB lesions from one marmoset (SI Appendix, Fig. S1C). We detected and quantified 36 water-soluble metabolites in eight caseous human TB lesions provided by L. Via and C. Barry (NIH) (SI Appendix, Table S1 A and B). We found 20 of these metabolites present in MEM- α with nucleosides (ThermoFisher 41061037) (*SI Appendix*, Table S1*B*). To MEM- α we added the remaining 16 metabolites to match their mean levels in human caseum (SI Appendix, Table S1B). We also added sphingomyelin, C24:1 lactosyl(fs)ceramide (d18:1/24:1), and C16 lactosylceramide (d18:1/16:0) based on semiquantitative evaluation of published TLC results (37). The phospholipids 1,2-dipalmitoylsn-glycero-3-phosphocholine (DPPC) and 1,2-dipalmitoylsn-glycero-3-phospho-racemic-(1-glycerol) (DPPG) were added to aid emulsification. Finally, we supplemented the aqueous base with 3% (vol/vol) human serum (a level typical of an inflammatory exudate) and sufficient polymorphonuclear leukocyte (PMN) lysate (6 μg DNA/10⁶ PMN) from healthy donors to provide 0.17 μg DNA/ μL MAF (SI Appendix, Fig. S2A), based on the following considerations. Rabbit caseum contained 0.17 µg DNA/mg caseum (36). Mtb are rarely numerous enough in caseum to be the chief source of the DNA. Though dying macrophages contribute to caseum, PMN (mostly neutrophils, with some eosinophils) are the predominant host cell in sputum and bronchoalveolar lavage (BAL) fluid of TB patients and the cell type most often containing Mtb in cavities, BAL fluid, and sputum (38-40). Necrotic TB lesions are chronic, and PMN have a short half-life. This suggests that products of dead PMN can accumulate. Accordingly, we made the simplifying assumption that most of the DNA comes from PMN and serves as a marker for the other cellular remains of PMN, including their antimicrobial proteins (41). The final concentrations of each component are listed in SI Appendix, Table S2 B-H, which match or approximate the foregoing measurements, with two major differences: We lowered the concentration of proteins by ~10-fold and of cholesterol, cholesteryl esters, triglycerides, and TAG by ~100-fold to produce an emulsion with a dynamic viscosity in the range of 1 mPa•s, for two reasons. This was necessary to allow reproducible robotic dispensation of 2 µL droplets from a suspension in which Mtb was distributed homogeneously, and, as will be seen below, it allowed for efficient generation of aerosols of respirable size. We speculated that these reductions in concentration may mimic dilution of caseum by bronchial secretions. We prepared MAF as a sterile emulsion that remains stable for at least 48 h. The osmolality of MAF (400 mOsm/kg) was higher than in 7H9 medium (120 to 160 mOsm/kg), closer to the osmolality of human serum (~295 mOsm/kg) and between the values reported for the mouse spleen (335 mOsm/kg) (42) and mouse tissue infected with bacille Calmette–Guérin (BCG), the vaccine strain of Mycobacterium bovis (400 to 600 mOsm) (43) (Fig. 1*C*).

Rheological Properties of MAF. We measured rheological properties of MAF and three reference solutions (Fig. 1D and SI Appendix, Fig. S1D and Table S3), the compositions of which are in SI Appendix, Table S2 A, B, and G). Considering that 93% of the volume of MAF consists of MEM- α and 16 additional metabolites, we compared MAF with MEM- α , the six

inorganic salts in MEM-α that account for most of its osmolality ("six salts") and water. The density, ρ_I , of the fluids is similar (SI Appendix, Fig. S1 D, a), consistent with their solute mass concentration of <2%. The dynamic viscosity, η , of the inorganic salt solution is similar to that of water (Fig. 1D and SI Appendix, Fig. S1 D, b). MEM- α and MAF have slightly higher dynamic viscosity, consistent with their content of amino acids and proteins (SI Appendix, Table S2 B, D, and F). The surface tension, γ_{GL} , of MAF was 40% lower than that of the other reference fluids, reflecting its higher content of surface active lipids and phospholipids (44).

Physical Properties of MAF Particles. Next we studied MAF's propensity to fragment into microdroplets upon aerosolization by an ExhaleSimulator (32) that generates an analog exhaled respiratory multiphase cloud characteristic of human violent exhalations (45-47). Fig. 1E shows a representative time-lapse superposed trajectory of the cloud. We compared MAF to a solution of NaCl ("saline") at the concentration found in MEM-α and to the six salts and sampled droplets along the trajectories of the cloud at various distances, focusing on particle sizes in the range of 0.5 to 20 μ m. At \approx 1 m from the source, MAF fragmented into a higher number of particles than the other fluids (Fig. 1F), consistent with its lower surface tension (Fig. 1D), and generated a high proportion of droplets of $\leq 3 \mu m$ diameter (Fig. 1G), similar to the size distribution of most of the particles containing viable Mtb captured from subjects with TB as they coughed (≤0.65 to 3.3 µm) (9).

Phenotype of Mtb in MAF. Two distinctive features of Mtb's residence in caseum are what appear to be a slowly or nonreplicating state and its phenotypic tolerance to antibiotics (30). We next asked whether Mtb incubated in MAF shares these features. To simulate the closed cavity environment, we incubated Mtb in MAF under 0.2% O₂, 5% CO₂, and compared its growth and survival to that of Mtb incubated in MAF under the standard laboratory condition of hyperoxia (21% O₂) while maintaining CO2 at 5% CO₂ (SI Appendix, Fig. S2A). Mtb did not replicate in MAF. Instead, it showed a relatively small time-dependent decline in survival that was greater in hypoxia (Fig. 2A) and became relatively tolerant to rifampicin, moxifloxacin, kanamycin, and isoniazid. The acquisition of tolerance was gradual in onset and showed a different time dependence for each antibiotic (Fig. 2 B-F), demonstrating that nonreplication was not a mechanistic explanation for the tolerance. The same trend was seen for Mtb in MAF under either 0.2% or 21% O_2 . Thus, the medium played a bigger role in inducing tolerance than the oxygen concentration.

Transcriptomic comparison of Mtb in MAF vs. Mtb in 7H9 under 0.2% O₂ or 21% O₂ (SI Appendix, Fig. S2B) further indicated that MAF does not induce metabolic dormancy but instead drives Mtb on a path of differentiation that differs from that of Mtb in 7H9. This was true regardless of the oxygen concentration, although Mtb did react somewhat differently to hypoxia than to hyperoxia (Fig. 2G). As compared to a replicating culture in 7H9, Mtb incubated in MAF for 2 wk under 0.2% O₂ upregulated more genes (376) than it downregulated (121), a ratio markedly different than for Mtb in 7H9 reacting to hypoxia (220 genes upregulated; 4 genes downregulated) (Fig. 2H). The pattern was similar for Mtb incubated in MAF under 21% O₂ (SI Appendix, Fig. S2C). Of the genes upregulated in hypoxic Mtb, 75% of those upregulated during incubation in MAF were different from those upregulated during incubation in 7H9 (Fig. 21). Among the genes most upregulated in MAF-incubated Mtb during hypoxia were canA and canB, encoding carbonic anhydrases. These catalyze

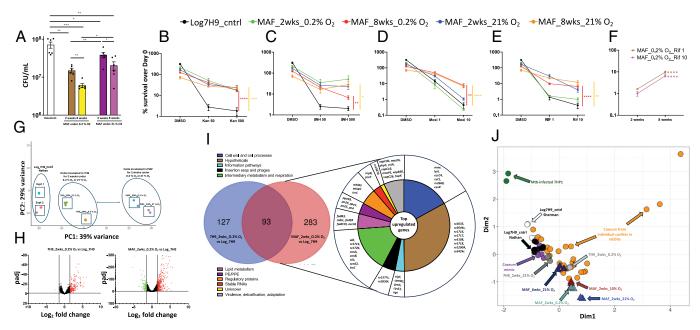


Fig. 2. Effects of MAF on Mtb's survival, drug tolerance, and transcriptome in bulk culture. (*A*) Survival of Mtb preincubated in MAF under $0.2\% O_2$, $5\% CO_2$ or $20\% O_2$, $5\% CO_2$ or $20\% O_2$, $5\% CO_2$ or $8\% CO_2$ or $8\% CO_2$ or $8\% CO_2$ or $9\% CO_2$ o

interconversion of CO₂ and bicarbonate and may play a role in Mtb's survival in bicarbonate-buffered MAF under 5% CO₂. Another highly upregulated gene was *icl1*, encoding isocitrate lyase, whose upregulation has been observed in Mtb in pulmonary cavities (49) (Fig. 2*I*).

Finally, we compared transcriptomes of Mtb H37Rv in MAF with the transcriptomes of Mtb HN878 in rabbit caseum (GEO accession number GSE273037), in a caseum mimic derived from lipid-fed THP1 human macrophage-like cells (49) and in THP1 cells themselves. We generated additional RNAseq datasets to simulate progression of Mtb in MAF from the atmosphere of a closed cavity (0.2% O_2 , 5% CO_2) to that approximating an open cavity (10% O_2 , 5% CO_2). Mtb in different caseous lung lesions had heterogeneous transcriptomes. Mtb's transcriptome in each of the test fluids mirrored the transcriptome of Mtb in some caseous lesions but not others (Fig. 2*f*).

In sum, MAF is an emulsion that can be prepared at will and in quantity without access to tuberculous caseum and that can induce a physiologic state in Mtb similar to that of Mtb in the caseum derived from some but not all tuberculous lesions. A major difference between MAF and caseum is that the more dilute state of MAF allows for rheological properties (Fig. 1D) that are compatible with simulated human violent exhalation inducing its fragmentation into microdroplets of the size range (Fig. 1E–G) of Mtb-bearing microdroplets recovered from people (9).

Survival of Mtb and BCG in MAF During Desiccation. Next, we assessed to what extent Mtb survives during desiccation in MAF compared to survival in water, phosphate-buffered saline (PBS), the standard 7H9 medium with glycerol as a supplemental carbon

source, and the former with an additional standard supplement consisting of oleic acid, albumin, dextrose, catalase (OADC), and tyloxapol. We also tested survival in MEM-α or in a solution of the six salts in MEM- α that account for most of its osmolarity. We pelleted Mtb from log phase culture in 7H9 with glycerol, OADC and tyloxapol in 21% O2, 5% CO2, washed the cells, and resuspended them in bulk culture in the foregoing media for incubation in 21% O₂, 5% CO₂ for 1 d. At that point, recovery of the input number of colony-forming units (CFU) was quantitative. In contrast, when the cells were then allowed to desiccate for 1 d in air in 2 μ L droplets, there was a 4.5 \log_{10} drop in CFU for Mtb in water, ~2 log₁₀ drop in PBS, ~1.8 log₁₀ drop in the solution of six salts, ~ 1.0 to ~ 1.6 log₁₀ drop in the two 7H9-based media, ~0.8 \log_{10} drop in MEM- α , and ~0.6 \log_{10} drop in MAF (Fig. 3*A*). Among the six salts, NaCl contributed most to protection against desiccation, followed by NaHCO₃, and the two of them together were as effective as all 6 (SI Appendix, Fig. S3 A, I). Addition of the water-soluble metabolites of MAF that are not present in MEM- α did not increase protection. However, the lipids, phospholipids, and proteins of MAF augmented protection during periods of desiccation longer than 1 d (SI Appendix, Fig. S3 A, II). Results were similar when Mtb was passed through the 1st and 2nd stages of the in vitro transmission model before desiccation (SI Appendix, Fig. S3B). BCG likewise survived for 1 d in bulk culture in water, six salts, MEM- α , and MAF. However, upon desiccation in microdroplets, BCG lost all detectable CFU in water and survived only marginally better when desiccating in the six salts solution. MEM- α and MAF afforded the best protection of desiccating BCG (Fig. 3A).

In sum, MAF has three important properties relevant to transmissibility of Mtb: induction of relative antibiotic tolerance,

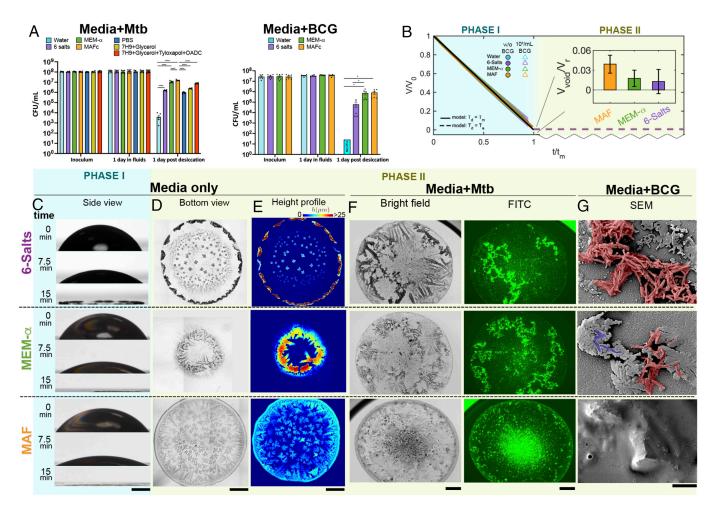


Fig. 3. Properties of desiccating droplets. (A) Survival of Mtb and BCG taken from log phase culture in 7H9 and transferred to the indicated fluids for 1 d in bulk culture before desiccation for 1 d in 2 μ L droplets. Means \pm SEM of two independent experiments, each in triplicate. * $P \le 0.05$, **** $P \le 0.0001$ by the unpaired t test. (B) Normalized volume, V/V_0 , as it changes from $V_0 = 2 \mu L$ in sessile droplets of MAF, MEM- α , six salts, deionized water, and MAF, with and without BCG, over normalized time, t/t_{CCRL} , compared to theoretical predictions taking the droplet temperature, T_d , to be either ambient temperature, T_a , (dashed black line) or measured droplet surface temperature, T_m (solid black line); see *SI Appendix*, Fig. S3 *C* and *D*. Phase I lasted about 15 min at relative humidity ≤5% and ambient temperature $T_a = 22$ °C. Inset shows void fraction, $V_{void}/V_r = (V_r - V_s)/V_r$, where V_r is the terminal residue volume and V_s is the compact volume of dry solutes. Shown for 10 measurements per condition (mean ± SE). (C) Time-lapse photographs capturing side views of evaporating droplets in Phase I and the transition to Phase II, where the residues of the evaporated droplets formed. The edge of the droplets remained pinned except for MEM-α, which receded to the partially pinned edge toward one side. (Scale bar, 500 µm.) (D) Bottom views of the residue of droplets in Phase II. (Scale bar, 500 µm.) (E) Height profile of droplets in Phase II, also quantified in SI Appendix, Fig. S3E, serves as basis, with SI Appendix, Fig. S3F, to compute the terminal residue volume, V_r, used in Phase II Inset in (B) for each fluid. (Scale bar, 500 μm.) (F) Brightfield and fluorescence photomicrographs of 2-μL desiccated droplets of the indicated fluids containing Mtb-Mrx1roGFP2. (Scale bars, 500 μm.) (G) Scanning electron micrographs of the surfaces of desiccated droplets containing BCG. Crumpled BCG cells (false-colored red) were found on the surface of desiccated droplets of six salts and MEM-α. Some nondeformed BCG (false-colored blue) were also found on the surface of desiccated droplets of MEM-α. No BCG were found on the surface of desiccated droplets of MAF. (Scale bar, 5 μm.)

induction of relative desiccation tolerance, and efficient generation of aerosols of respirable size. Induction of antibiotic tolerance would not have begun to advantage Mtb's transmission until about 75 y ago, and we have not compared simpler fluids for induction of antibiotic tolerance. However, MAF outperformed the simpler fluids we tested with respect to desiccation tolerance and aerosol generation.

Physical Environment of the Desiccated Droplets. To explore how MAF may protect Mtb from desiccation, we first compared the rate of evaporation of 2 µL droplets of MAF and the comparator fluids on the same tissue culture-compatible polystyrene surfaces used to study survival of desiccating Mtb, given that different timescales of evaporation could lead to distinct stresses on the organisms. Contact angles varied from 50° to 80°, with MAF being the most wetting, consistent with its surface-active components, but there was no significant difference in initial evaporation dynamics (Phase I) (Fig. 3B). From side-view imaging (Fig. 3C) we measured droplet volume and its rate of change, with and

without BCG, which was compatible with a first-order diffusiondriven evaporation law (50) when corrected to account for surface wetting, expected evaporative cooling, and surface heat-exchange (Fig. 3B and SI Appendix, Fig. S3 C and D and Materials and Methods). However, the Phase I evaporation is macroscopic (millimeters) compared to the size of mycobacteria (microns). To characterize evaporation in the microenvironment of most relevance to the mycobacteria (Phase II), we turned next to smaller-scale imaging. Fig. 3 C-F reveal fluid-specific structural distinctions among the residues of the desiccated sessile droplets of MAF, MEM-α, and six salts. Quantitative profilometry showed distinct height profiles at the periphery (Fig. 3E and SI Appendix, Fig. S3 E and F) typical of "coffee-ring" elevated edges (Fig. 3 D and E and SI Appendix, Fig. S3 F-I) (51) that emerge via capillary driven flow, favoring solute transport to and deposition along the droplet's boundary contact line edge. Residues from desiccated water droplets had little visible internal structure (SI Appendix, Fig. S3 H and I) as expected, while cuboidal and dendriform crystals emerged in residues of desiccating six salts and MEM-α

droplets, respectively. In these fluids Mtb and BCG appeared to coat or be colocalized with some of the larger dendritic crystals (Fig. 3F). In contrast, MAF residues were characterized by more amorphous crystals (Fig. 3F). Moreover, in residues of MAF (Fig. 3F), BCG (SI Appendix, Fig. S3H) and Mtb (SI Appendix, Fig. S3I) clustered in the center. Both differences are consistent with the role that surfactants and proteins can play in altering crystal and residue formations (52–54). Analysis of atomic composition confirmed that the crystals were mainly made of NaCl, while O was distributed throughout the residues of MAF and appeared enriched along the crystal borders for the other two fluids (SI Appendix, Fig. S3J).

We integrated the height profile of the desiccating droplets to measure the volume of the residues V_r in Phase II. We calculated the volume of solutes V_s using their mass and density and the associated residue "void" fraction as $V_{void}/V_r = (V_r - V_s)/V_r$. Residues of MAF held the highest "void" fraction, compatible with higher hydration (Fig. 3B).

Scanning electron microscopy (SEM) revealed that in droplet residues of water, six salts, and MEM-α, BCG cells were found on the external surface (Fig. 3G and SI Appendix, Fig. S3 K and L). In contrast, bacteria were not seen on the surface of MAF residues (Fig. 3G and SI Appendix, Fig. S3M). Instead, fluorescence microscopy revealed BCG (SI Appendix, Fig. S3H) and Mtb (Fig. 3F and SI Appendix, Fig. S3I) confined to the interior of MAF residues. BCG exposed on the surface of residues of MEM- α , six salts (Fig. 3G and SI Appendix, Fig. S3 K and L) and water (SI Appendix, Fig. S3K) appeared shrunken and crumpled (artificially colored red in Fig. 3G), reminiscent of mechanical buckling, wrinkling, and dimple formation of emptied shells (55) and consistent with the shrinking and wrinkling of bacterial membranes in hypertonic solutions (56, 57). In MEM-α residues, some BCG cells encased in crystals (artificially colored purple) appeared to retain their outer structural integrity (Fig. 3G). In sum, physical properties of the media confer important heterogeneity and shape distinct local structures upon desiccation. In contrast to the other fluids, desiccating MAF forms a matrix that may protectively encapsulate mycobacteria while also maintaining their shape and apparent integrity.

Candidate Transmission Survival Genome of Mtb. To conduct genome-wide screens, we used a CRISPRi library that targets 4,014 Mtb genes with an average of 20 sgRNAs for each gene (58). We predepleted the library with anhydrotetracycline (Atc) for 5, 10, and 20 generations in 7H9 in 21% O₂, 5% CO₂ to achieve varying degrees of gene silencing. Each generational version of the library was then resuspended in MAF and sequentially subjected to one or more of the three stages of the in vitro transmission model: bulk culture for 1 to 2 wk in a closed cavity environment $(0.2\% O_2)$, 5% CO₂), followed by bulk culture for 1 to 2 wk in an open cavity environment (10% O₂, 5% CO₂), followed by desiccation in 2 μL droplets for 18 to 24 h or 3 d in an aerosol environment (21% O₂, 0.04% CO₂). It is possible that Atc-dependent suppression of gene function may not have persisted through the longer periods of culture; if so, this might have led to some false-negative results. Fig. 4A and SI Appendix, Fig. S4 A-C list the three independent CRISPRi screens done for different stages. Libraries collected after each stage of the model with and without outgrowth in complete 7H9 medium in 21% O₂, 5% CO₂ were subjected to genomic DNA isolation and sgRNA sequencing. Postsequencing analysis using MAGeCK (59) identified significant depletions by comparing sgRNA abundances between conditions. We identified as a "significant difference" any decrease in sgRNA read-counts at a level corresponding to a \log_2 fold-change (FC) of ≤ -1.5 with a padj ≤ 0.05 (where "padj" is a *P*-value corrected for multiple hypothesis testing) when comparing a condition to any earlier condition. Thus, the number of possible comparisons increased with each successive stage: 12 for stage 1, 16 for stage 2 and 20 for stage 3 (Fig. 4A) (during manual quality control, two sample sets belonging to stage 3 were discarded due to missing values or zero LFC values resulting in 18 comparisons for stage 3) as detailed in https://doi.org/10.7298/e4xs-y663 (60) and Dataset S1. We then tallied the number of significant differences (NOSDs) for each of the 4,014 Mtb genes both for individual stages and for all three stages combined (SI Appendix, Fig. S4D). The larger the NOSDs for a given gene, the stronger the inference that the gene contributes to Mtb's survival in at least one stage of sequential testing and likely in more than one stage. Smaller NOSDs for a given gene are more difficult to interpret. A NOSD of 1 indicates nonreproducibility in the independently conducted screens, but could be of interest for hypothesis generation. A NOSD of 2 or 3 at an early stage of testing could be meaningful if knockdown of the gene reduced the population of cells bearing those sgRNAs to such an extent that there were insufficient reads to allow statistical inference at later stages.

The highest NOSDs achieved for an individual gene were 10 for the 1st stage, 8 for the 2nd stage, 13 for the 3rd stage, and 28 for the three stages combined, as illustrated in *SI Appendix*, Fig. S4D. The highest NOSDs in any stage were registered for genes of both known (*clpC1*, *ftsZ*, *rpoC*, *tatC*, *mtrA*, *secY*, *rnc*, *dnaB*, *rfe*, *clpP2*, *pknB*, *gyrB*, *murB*) and unknown (*rv1828*, *rv0430*, *rv1697*, *rv1480*, *rv2969c*) function. The numbers of genes with NOSDs \geq 1 were 2,508 in the 1st stage, 1,596 in the 2nd stage, and 1,949 in the 3rd stage. Collectively, 69% of the 4,014 genes had NOSD \geq 1 and 45% had NOSD \geq 3 in any of the stages (31%, 10%, and 29% in 1st to 3rd stages, respectively). In sum, these results suggest that a significant proportion of Mtb's genome may contribute to its survival in one or more of the modeled stages of transmission.

In Fig. 4*B*, we ranked genes in sliding windows of 100 from those with the highest to the lowest NOSDs. Within each window we noted the proportion that have been designated as conventionally essential or conventionally nonessential in 7H9 in 21% O_2 , 5% CO_2 (61) (Fig. 4*B*). Most genes with high NOSDs are conventionally essential. However, 64% (1,873) of conventionally nonessential genes had NOSDs \geq 1, along with 457 that are conventionally essential.

Next, we focused on stage-specific comparisons to identify some of the critical genetic pathways predicted to sustain Mtb during the stresses of transmission, aided by volcano plots of the median \log_2 FC for all stage-relevant comparisons against the negative \log_{10} of the median FDR-adjusted *P*-value (Fig. 4 *C*–*E*). Among the topmost hits were *clpC1*, *clpX*, *clpP1*, and *clpP2*, which encode the Clp chaperonin–protease complex (Fig. 4 *C*–*E*). Also prominent were other proteostasis pathway genes: proteasome genes *prcA* and *prcB*, chaperonin *groEL2*, and chaperone *dnaJ2*.

The conservative presentation of *median* FC across multiple comparisons for individual stages obscures the extent of depletion (negative FC) imposed by any one of the sequential stresses in any one comparison. In contrast, Fig. 4F shows each gene's maximally negative, statistically significant FC in any one condition for any one comparison according to whether the genes are designated as conventionally essential or nonessential. In general, there were more severe consequences for depletion of conventionally essential genes than for conventionally nonessential genes. Nonetheless, there were substantial survival penalties under the conditions tested for the individual knock-down of large numbers of conventionally nonessential genes.

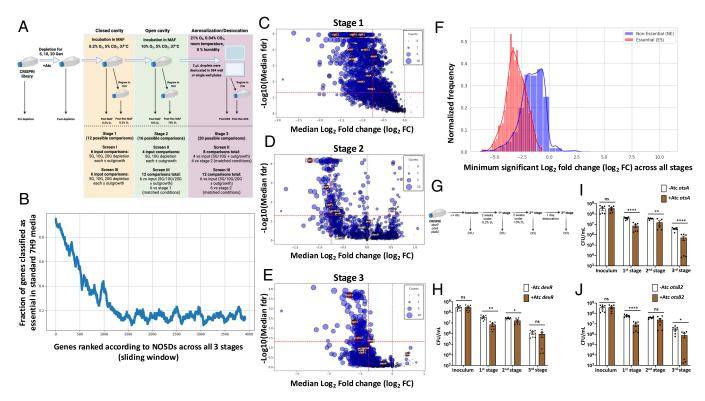


Fig. 4. Genome-wide CRISPRi screen of Mtb during three modeled stages of transmission. (A) Schematic of the screen across transmission stages (created with BioRender.com) and summary of comparisons. Each stage allows for multiple possible comparisons where significant differences may be detected. Stage 1:12 possible comparisons against the input library across two screens, each testing three predepletion times (5, 10, 20 generations) with and without outgrowth in 7H9 in 21% O_2 , 5% CO_2 after exposure to the conditions of the stage. Stage 2: 16 possible comparisons, combining comparisons to the input library and stage-to-stage comparisons. Stage 3: 20 possible comparisons. "Matched" comparisons maintain the same predepletion time and outgrowth condition between stages (e.g., comparing Stage 2 vs. Stage 1 at 5 generations, no outgrowth). (B) Variation in frequency of conventionally essential genes in MAF as a function of the NOSDs for each gene across all stages of the CRISPRi screen. Genes with the highest NOSDs are listed at the Left and those with fewest NOSDs or none to the Right. Within each set of 100 consecutive genes, the proportion of genes is indicated that were previously categorized as essential in standard culture conditions in 7H9 or 7H10 media. (C-E) Volcano plots for 1st, 2nd, and 3rd stages, in which the median log₂ FC for all significant differences in expression of a given gene at any stage compared to the starting libraries or the earlier stages is plotted against the median false discovery rate for those differences. Symbols for each gene are sized in proportion to the NOSDs ("Counts"). (F) Frequency distribution of the most negative log₂ FC for each gene at any stage according to whether the gene has been characterized as essential (red bars) or nonessential (blue bars) under conventional conditions. For ease of visualization, the height of each histogram is normalized to equalize the areas under the curve for genes of the two classes. (G) Schematic of CFU survival assay described in Fig. 4 H-J (created with BioRender.com). (H-J) Survival assay for CRISPRi knockdown strains of (H) devR, (I) otsA, and (J) otsB2. Data are means ± SEM of two independent experiments. P values were determined by the unpaired t test. $*P \le 0.05$; $**P \le 0.01$; $****P \le 0.0001$; ns = nonsignificant.

To test the validity of the screens, we cross-referenced known regulators of Mtb's response to hypoxia and desiccation. The regulator of hypoxia response *devR* was among the top hits in the 1st stage (0.2% O₂). During the 2nd stage (10% O₂), the median log₂ FC for devR increased from -0.73 to +0.18 (Fig. 4 C and D and respective source data files); that is, its knockdown ceased to appear consequential at the higher level of O_2 . During hypoxia, trehalose monomycolate and trehalose dimycolate are catabolized into activated pentose phosphate intermediates, which may prepare Mtb to resume peptidoglycan biosynthesis upon reaeration (62). Trehalose biosynthesis genes otsA and otsB2 were among the top hits during hypoxia (Fig. 4C). Their NOSDs decreased and median log₂ FC values increased (that is, became less negative) upon the shift from 0.2% O₂ to 10% O₂ (SI Appendix, Fig. S4E and source data files for Fig. 4 C and D). Proteostasis pathway genes and many others followed the same trend (SI Appendix, Fig. S4E), suggesting that transfer from an O₂ concentration of 0.2% to adaptation in 10% O₂ might allow the subsequent outgrowth in room air of cKD cells that would fail to replicate if taken directly from 0.2% O₂ to 21% O₂ in a medium that supports replication. We then created separate CRISPRi knockdown strains for devR, otsA, and otsB2 (SI Appendix, Table S4), predepleted the genes in the presence of Atc, transferred the cells to MAF and carried them sequentially through the three stages (Fig. 4G). Depletion of devR, otsA, and otsB2 in the closed cavity conditions each led to a ~0.5 log₁₀ drop

in CFU. For the devR knockdown strain, the survival defect was not increased upon shift to the open cavity environment (Fig. 4*H*). Individual knockdown of *otsA* and *otsB2* caused \sim 0.5 log₁₀ decrease in CFU upon desiccation (Fig. 4 I and J), perhaps reflecting the role of trehalose as an osmoprotectant.

Dependence of Transmission-Related Survival on Proteostasis Genes. Genes encoding *clpC1* and other members of the Clp complex were the most highly depleted genes during all stages, particularly during desiccation, along with other members of proteostasis pathway, namely prcBA, dnaJ2, and groEL2 (Fig. 5A). Conditional knockdown strains for clpP1P2, groEL2, and dnaJ2 were precultured in the absence or presence of Atc and tested along with a ΔprcBA knockout strain and the corresponding wild type Mtb. We sequentially incubated the strains in MAF in the 1st stage for 2 wk, the 2nd stage for 2 wk, and the 3rd stage (desiccation) for 1 d. Compared to the controls, knockdown of clpP1P2 and knockout of prcBA led to ~1 log₁₀ drop in CFU during the 1st stage (Fig. 5 B and C) but no drop in the 2nd stage. In fact, the CFU level rose in the 2nd stage (Fig. 5 B and C). Considering that Mtb does not replicate under those conditions, the reappearance of CFU suggests that *clpP1P2* knockdown and Δ*prcBA* Mtb may have formed "differentially detectable" (DD) Mtb (63) in the 1st stage. DD Mtb have been shown to form in response to oxidative damage (63). CFU dropped again with desiccation of the clpP1P2

knockdown and $\Delta prcBA$ strains in the 3rd stage (Fig. 5 *B* and *C*). Knockdown of the chaperonin *groEL2* and the chaperone *dnaJ2* led to a drop in survival of more than ~0.5 log₁₀ only during the 3rd stage (Fig. 5 *D* and *E*). We saw a similar phenotype with hypomorphs of *clpC1* and *clpP1P2* produced by CRISPRi, where the phenotype reversed in the 2nd stage and reappeared in the 3rd stage (*SI Appendix*, Fig. S5A).

There were 121 genes with NOSDs \geq 1 *only* during the 3rd stage (desiccation) (SI Appendix, Fig. S5B), including rv3662c (NOSDs = 6), rv0443 and fadE5 (NOSDs = 5), rv1404 (NOSDs = 4), and rv1435c, rv3195, rv2661c, rv3716c, and narG (NOSDs = 3). Six of these nine genes are bioinformatically linked to the *clp* system, and two of them, the conserved hypothetical proteins rv3195 and rv3716c, are linked with each other as well (SI Appendix, Fig. S5C) (https://string-db.org/network/83332.Rv2460c) (64). The levels of mRNA of their homologs in Corynebacterium glutamicum (NCgl0748 and NCgl0240) are increased in that species' $\Delta clpC$ mutant and restored upon deletion of clgR, a transcriptional regulator whose homolog in Mtb activates genes encoding ClpP1, ClpP2, two other proteases (PtrB and Rv1043c), ClpC, and chaperones ClpB and Acr2 (65). Moreover, Rv0443 was enriched in clpC1- and clpP2-depleted Mtb (66), while Rv1404 and Rv2661c are predicted to interact with ClpC2 (http://galaganlab.bu.edu/ tbdb_sysbio/CC/Rv2667.html) and NarG with ClpP2 (https:// www.hitpredict.org). In Mycobacterium smegmatis, D'Andrea identified interactions of ClpC1 with the homologs of FadE5, Rv3195 and Rv3716c (67).

Candidacy of Hydrophilin-Like PE-PGRS Proteins. In 2000, Garay-Arroyo et al. reported that the late embryogenesis abundant (LEA) proteins of plants increased in abundance in seeds at the onset of desiccation (68). In their hydrophilicity and abundance of glycine, the LEA proteins resembled proteins the authors called "hydrophilins" in Saccharomyces cerevisiae and Escherichia coli that increased during hyperosmosis (68). The hydrophilin proteins DtpA and DtpB in Acinetobacter baumannii are intrinsically disordered (69). We used hydrophilicity index, glycine content, and the fraction of residues classified as belonging to intrinsically disordered regions to identify a cluster of 50 conventionally nonessential Mtb genes with high values for all three descriptors (Fig. 6A; source file for Fig. 6A and SI Appendix, Fig. S6). Of these, 49 belong to the PE-PGRS family. Those with a higher NOSD seem more likely to play a role in tolerance to desiccation, but even those with a NOSD of 1 may warrant investigation, given the striking physical properties predicted for the encoded proteins and the possibility of redundancy among the 27 members of the family with NOSD ≥ 1 in the desiccation stage (Fig. 6*B*). The only protein in the cluster not belonging to the PE-PGRS family is Rv0378, a 73-amino acid protein predicted to be highly disordered (*SI Appendix*, Fig. S6).

Discussion

In 1998, Cole et al. (70) reported the sequence of Mtb's genome. The ensuing quarter century has witnessed a near-exponential increase in publications about Mtb genes along with multiple breakthroughs in relevant technologies. Yet the proportion of Mtb genes with defined physiologic functions has approached an asymptote, with about 27% of genes unassigned (71) and a similar proportion bearing speculative annotations. Here, we have addressed two possible reasons for this knowledge gap: use of unphysiologic culture media and lack of models of aerosol transmission amenable to the study of genotype-phenotype correlation. Many of the genes of unknown function are also conventionally nonessential, and many conventionally nonessential genes are members of the candidate transmission survival genome. That may help to reveal the function of some of them, as speculatively suggested by the findings of hydrophilin-like features of multiple PE-PGRS proteins in the candidate transmission survival genome (Fig. 6).

In 1947, Dubos and Middlebrook introduced a medium that supported Mtb's replication as fast as or faster than any other, noting that "Mixtures of sodium and potassium phosphates provide a satisfactory buffer system" (72). Such media, including today's Middlebrook 7H9, 7H10, and 7H11, bear little resemblance to the human environments in which Mtb spends all of its natural life except in transit to new hosts. Standard culture conditions for Mtb are hypotonic, hyperphosphatemic, alipidic, hypocapnic, and hyperoxic relative to Mtb's human environments. We compiled published and original observations on the composition of necrotic cavities from Mtb-infected people, nonhuman primates, and rabbits to develop MAF. Rather than strive for the simplest mimic of cavity fluid that induces some predetermined state in Mtb, we sought to include every known component of cavity fluid, reasoning that any component might influence the fluid dynamics (24) and transmission biology in unanticipated ways. For example, we found deoxysphinganines in tuberculous caseum. Their impact is unknown, but sphingomyelin promotes Mtb's growth in vitro (73), certain dihydrosphingosines have potent antimycobacterial activity (74), and sphingolipids can

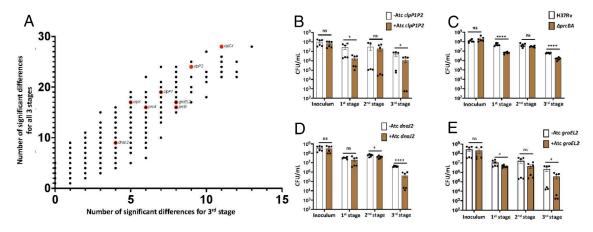


Fig. 5. Prominence of proteostasis genes in Mtb's survival during modeled transmission. (*A*) Comparison of NOSDs for all stages vs. 3rd stage. Each dot corresponds to a gene with NOSD ≥ 1 in the 3rd stage. (*B*–*E*) Survival assay for Mtb knockdown or knockout strains of (*B*) clpP1P2, (*C*) prcBA, (*D*) dnaJ2, and (*E*) groEL2. Data are means ± SEM of two independent experiments. *P* values were determined by the unpaired *t* test. **P* ≤ 0.05; *****P* ≤ 0.0001; ns = nonsignificant.

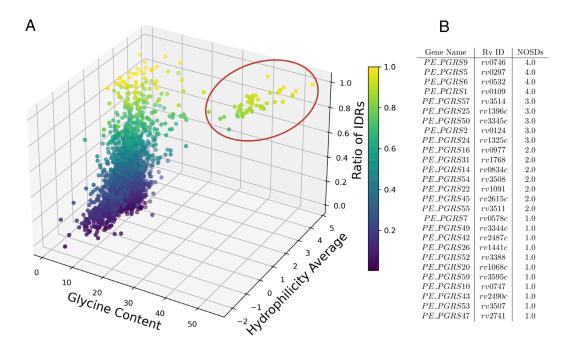


Fig. 6. Identification of hydrophilin-like proteins as desiccation stage candidates in the transmission survival genome of Mtb. (A) Analysis of the full Mtb proteome in three descriptor dimensions: glycine content, hydrophilicity (averaged across all residues in each protein), and ratio of residues predicted to be in intrinsically disordered regions. Highlighted cluster contains 50 proteins. (B) Proteins in the highlighted cluster whose genes had NOSD ≥ 1 in the desiccation stage.

affect the fusion of lysosomes with mycobacteria-containing phagosomes (75).

The drug tolerance and transcriptomic phenotypes of Mtb incubated in MAF mimicked those of Mtb in authentic caseum (30) and in a caseum mimic made from the aged lysate of stearic acid-fed, macrophage-like THP1 leukemia cells (49). Compared to water, 7H9, PBS, and the mammalian cell culture fluid MEM-α, MAF was most effective at protecting Mtb from death during desiccation in air. The reasons require further study, but may include three features of the fluid biophysics of desiccating droplets of MAF: 1) they appeared to retain more water than comparator fluids; 2) they formed residues that excluded mycobacteria from the air-exposed outer surface; and 3) they promoted aggregation of Mtb in the center of the droplet, reducing the proportion of mycobacterial surfaces exposed to the suspending medium. Such aggregation might favor retention of intrabacterial water, much as aggregation of Streptococcus pneumoniae protects them from desiccation (76). It will be of interest to explore whether biomolecular condensation of proteins within Mtb in desiccating droplets liberates water from the proteins' hydration shells to buffer the stress of hyperosmolarity and cooling during desiccation (77).

Using MAF and a sequence of atmospheres, we sought to build a list of genes that Mtb may require to survive emergence from a hypoxic state in a necrotic, PMN-rich lesion into a euoxic pulmonary cavity and expulsion into the air in a microdroplet of bicarbonate-buffered fluid small enough to stay suspended until it is inhaled, while cooling, concentrating, alkalinizing, and becoming hyperoxic. These stresses constitute an evolutionary bottleneck for Mtb. The "transmission survival genome" sculpted by that bottleneck may encode potential targets for intervention to reduce transmission. Interest in finding ways to interrupt transmission (78) is heightened by the finding that 80% of people with pulmonary symptoms reporting to a TB clinic in a high-incidence community who did not receive a diagnosis of TB were nonetheless found to be exhaling viable Mtb (79). Given TB's reproduction number (R_0) of 5 to 15 (second only to measles'), preventing transmission is indispensable to end the TB pandemic.

The need to cope with oxidative stress and to refold damaged proteins or dispose of them emerged as a prominent role of the genes on which Mtb depended to survive modeled transmission. Most bacteria die upon desiccation (80). Some, like B. anthracis, survive by forming spores. Bacteria that forego sporulation yet repair their DNA upon rehydration and survive, such as species of Deinococcus, Chelatococcus, Methylobacterium, and Bosea, are those that succeed in protecting their proteins from oxidation (81). Similarly, genes contributing to Acinetobacter's desiccation tolerance encoded antioxidant, DNA repair, and proteostatic functions, as well as hydrophilins (69, 82). Acinetobacter's hydrophilins are speculated to act as chaperones protecting proteins from dehydration-induced denaturation (82). We identified 50 conventionally nonessential Mtb genes that resemble hydrophilins in having high proportions of hydrophilic amino acids and glycines (68) and being intrinsically disordered. Our screens indicated that 27 of these may warrant investigation as potential contributors to Mtb's survival from desiccation. If further work confirms that role, it would add to the diverse functions ascribed to the PE-PGRS gene family (83) related to their contribution to virulence (84).

Proteins are expressed at levels close to their solubility limits in Caenorhabditis elegans, risking aggregation with loss of cell water (85). When falling temperature increases cytosolic viscosity, yeast cells adapt by regulating their synthesis of glycogen and trehalose (86). This may help explain why genes involved in trehalose metabolism were prominent in our screen.

There have been few preclinical models of aerosolization of Mtb and none to our knowledge that identified genes that contribute to Mtb's survival. Loudon et al. (87) observed ~1 log₁₀ reduction in Mtb CFU within 60 min after aerosolization in "Dubos medium." Lever et al. (88) observed a ~2 log₁₀ reduction in Mtb CFU within 60 min when bacteria taken directly from aerobic culture on plates containing Middlebrook 7H10 medium were mechanically aerosolized in artificial saliva containing a bovine salivary gland glycoprotein (89). Pfrommer et al. (40) studied Mtb aerosols generated in PBS. To our knowledge, no earlier in vitro studies of mycobacterial aerosols have preconditioned the bacteria in lesion-like conditions. Collection of exhaled

Mtb from patients with TB is an important research tool (9–13) but does not allow for deliberate, selective, or systematic genetic variation in the Mtb.

In sum, studies of MAF as a model for TB lesional fluid are consistent with evidence that Mtb induces the host to provide it with a medium that confers tolerance to some antibiotics (30) and reveal that such a fluid can promote formation of aerosols in a size range consistent with substantial time in the air and access to pulmonary alveoli in new hosts, while partially protecting Mtb from death in rapidly shifting environmental conditions before and during its airborne journey. To the extent that our study of sessile droplets is relevant to aerosol transit, Mtb may depend not only on the host fluid in which it is carried but also on hundreds of its own genes. Study of Mtb's transmission survival genome may also reveal essential functions for many of the 3,008 genes that have been called nonessential (61) based on experiments in laboratory conditions and animal models that do not include transmission.

Limitations of the Study

Our model of sequential stages of transmission of Mtb necessarily has many limitations. No one set of conditions can recapitulate the heterogeneity of TB lesions, and not all transmission of TB originates from cavities. MAF is a complex medium and inclusion of human serum and PMN lysate means that MAF is not fully defined. We did not model the oscillations in the pH of airway fluids that occur with tidal breathing. Such oscillations were bactericidal for *Pseudomonas aeruginosa* (90). Our study was limited to the dispensation of relatively large, sessile droplets on an artificial surface. That slows the desiccation process by orders of magnitude compared to what occurs in smaller in-flight microdroplets surrounded by air. The resulting differences in rate of change, phase transition, and composition and structure of the intradroplet environment could affect which genes Mtb depends on to survive and to what extent. This makes it risky to extrapolate from the relatively modest survival deficits we observed here for individual knock-out and knockdown strains to what may be seen during aerosol infection of mice. The survival deficits for individual gene-depleted strains should be assessed in the context that each of the separately tested genes appears to act nonredundantly and they and others would act collectively. The operational scale of genome-wide screening obliged us to choose single values for relative humidity and ambient temperature. Other than their size, we have not yet characterized physical features of droplet nuclei that could influence their efficiency in reaching distal airways. Finally, we have not proved that knockout or knockdown of any one gene in the candidate transmission survival genome of Mtb will impair Mtb's infectivity upon inhalation of microaerosols by an experimental animal. Such studies require the design, construction, validation, and installation of new kinds of equipment in BSL3 facilities. Those efforts are underway.

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Methods

Methods given in full in *SI Appendix* include the details of microbial culture; identification of components of caseum; composition and preparation of MAF; determination of tolerance to drugs; conduct of RNAseq; performance of the genome-wide screen; analysis for gene essentiality under the screening conditions; preparation of individual CRISPRi knockdown strains; determination of fluid densities, surface tensions, shear viscosities, and fragmentation characteristics; and study of droplets for their rates and extents of evaporation, appearance by fluorescence and scanning electron microscopy, and atomic distribution by energy-dispersive X-ray spectroscopy. Detailed mathematical models are provided for the biophysical observations.

Data, Materials, and Software Availability. RNA and DNA sequences data have been deposited in NCBI (PRJNA1140188 (91), PRJNA1208037 (92), PRJNA1208562 (93), and PRJNA1209129 (94)). All other data are included in the manuscript and/or supporting information.

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