

1. Supplementary Figures

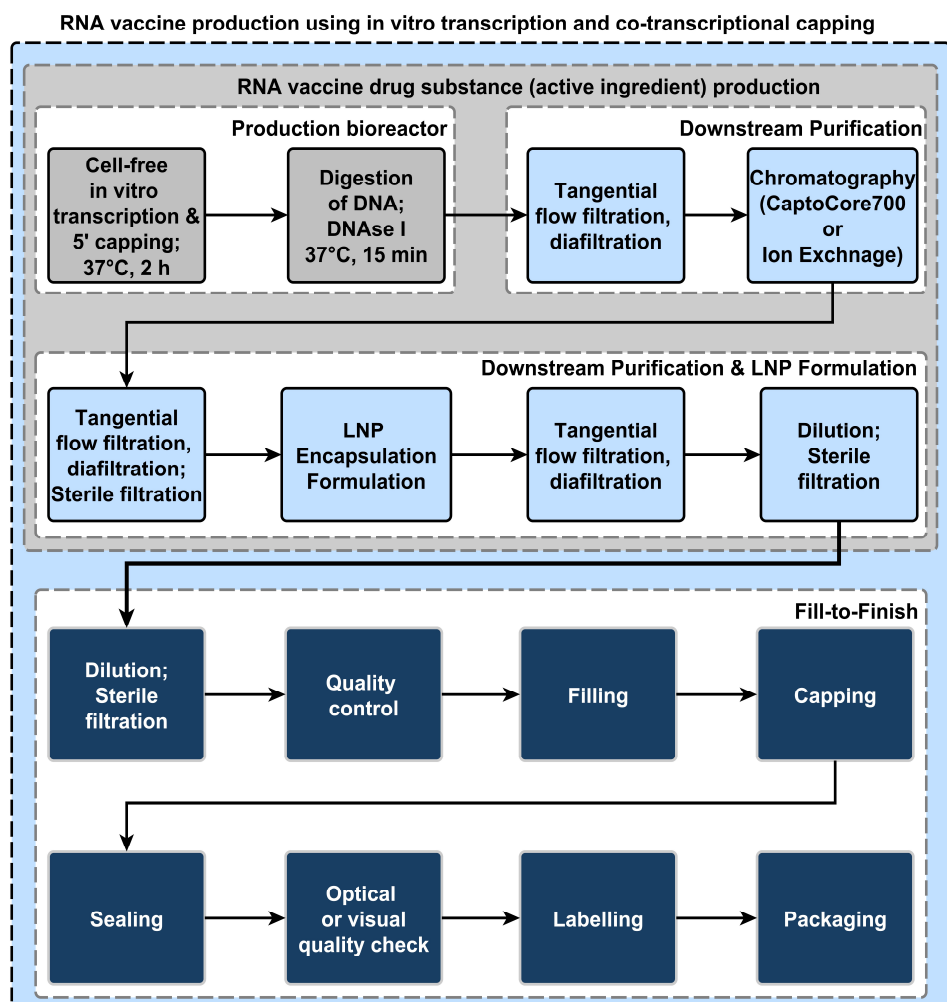


Figure S1. Process flow diagram for RNA vaccine drug substance production (aka. active ingredient production, bulk production or primary manufacturing) and drug product manufacturing (aka. fill-to-finish or secondary manufacturing). The drug substance is produced in the production bioreactor based on the *in vitro* transcription reaction using the T7 RNA polymerase enzyme, and 5' capping of the RNA is achieved co-transcriptionally using 5' cap analogues (needed to ensure antigen expression). Following RNA synthesis, the DNase I enzyme is added to the bioreactor to digest the template DNA and then the reaction mix leaves the bioreactor and enters the downstream processing section. For downstream purification, tangential flow filtration (TFF) can be used to retain the RNA molecule by the filter and let the other components of the reaction mix flow through the TFF as these are smaller in size than the RNA molecule. Next, the retentate containing the RNA of interests is purified by a chromatography unit operation, such as CaptoCore 700 chromatography, ion exchange chromatography or hydroxyapatite chromatography, whereby the protein enzymes can be removed. Next, a second TFF step is carried out whereby the buffer is replaced for the formulation buffer and then the RNA solution is sterile filtered before entering the lipid nanoparticle (LNP) encapsulation unit operation which is the bottleneck for the RNA drug substance production (aka. primary manufacturing) section. Following the formulation step the LNP encapsulated RNA solution enters a third TFF for diafiltration then an optional dilution step is carried out followed by a sterile filtration operation. The sterile LNP-encapsulated RNA solution is then transferred to the fill-to-finish (aka. secondary manufacturing) section. There, an optional dilution step followed by sterile filtration can take place. Next, the formulated RNA solution undergoes quality control and is filled into vials or other containers. The vials are then capped, sealed, inspected using automated image processing, labelled and packaged into secondary and tertiary packaging. If blow-fill-seal [1,2] or the Intact™ Modular Filler [3,4] is used for fill-to-finish,

than the filling, capping and sealing operation can be combined. The entire production process is independent of the RNA sequence, therefore in principle vaccines against virtually any disease can be produced using the same production process [4–10].

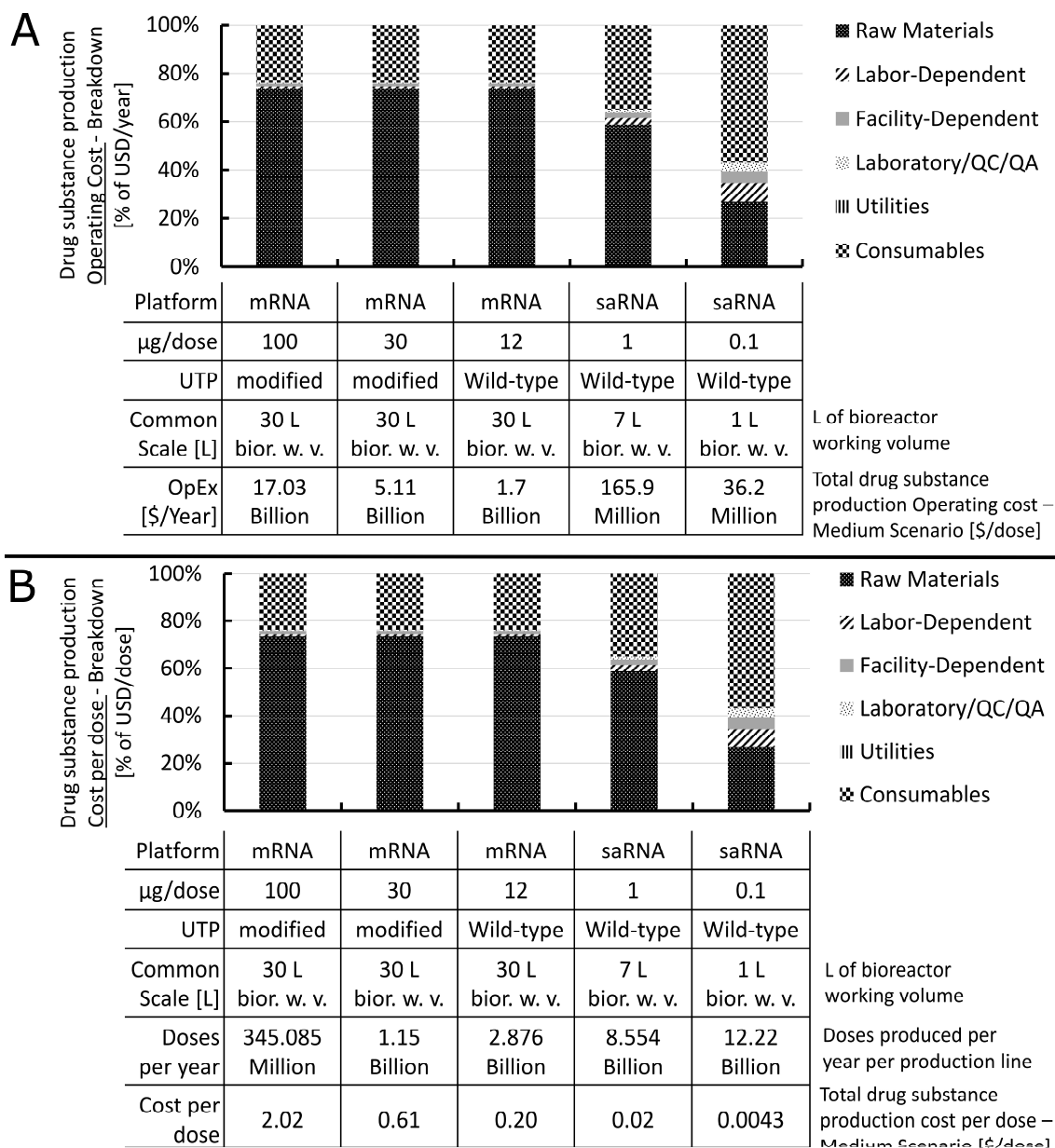


Figure S2. Breakdown of annual operating costs and cost per dose for LNP-formulated RNA drug substance production based on the five RNA vaccine types listed in Table 1. **A.** Share of operating cost (OpEx) components. The percentage of each OpEx component is shown on the y-axis and the five RNA types are shown on the x-axis. The table below the x-axis also indicates the total OpEx in USD per year for a single facility with a single production line at the common scale. **B.** Share of cost per dose components. The percentage of each cost per dose component is shown on the y-axis and the five RNA types are shown on the x-axis. The table below the x-axis also indicates the total cost per dose for LNP-formulated RNA drug substance production. The number of LNP-formulated drug substance doses produced per year are also shown for a facility at the common scale which is indicated in the table below the x-axis.

2. Supplementary methods

Techno-economic modelling

Table S1. Input parameters and assumptions used for techno-economic modelling in SuperPro Designer.

Parameter use	Parameter class	Parameter name	Value	Unit
CapEx calculation	Direct Cost (DC)	Piping Cost	35	% of TEPC
		Instrumentation Cost	40	% of TEPC
		Insulation Cost	03	% of TEPC
		Electrical Facilities Cost	10	% of TEPC
		Buildings Cost	250	% of TEPC
		Yard Improvement Cost	15	% of TEPC
		Auxiliary Facilities Cost	40	% of TEPC
		Unlisted Equipment Purchase Cost (UEPC)	30	% of TEPC
		Unlisted Equipment Installation Cost	50	% of UEPC
		Indirect Cost (IC)	Engineering Cost	25
	Construction Cost		35	% of DC
	Other Cost (OC)	Contractor's Fee	5	% of (IC + DC)
		Contingency	10	% of (IC + DC)
	Miscellaneous	Working Capital – to cover expenses for	10 mRNA & saRNA	days
		Start-up and Validation Costs	30	% of DFC
		Up front R&D	0	US\$
		Up front royalties	0	US\$
Facility dependent	Maintenance: equipment specific multipliers			
	Depreciation: contribution from each equipment's undepreciated purchase cost			
	Insurance	1	% of DFC	
	Local taxes	2	% of DFC	
	Factory expenses	5	% of DFC	
OpEx calculation	Labour	Basic operator labour rate (BOLR)	25	USD × hour ⁻¹
		Benefits factor	40	% of BOLR
		Operating supplies factor	10	% of BOLR
		Supervision factor	20	% of BOLR
		Administration factor	60	% of BOLR
		Lumped operator labour rate	57.5	USD × hour ⁻¹
		Adjusted basic operator labour rate*	57.5	USD × hour ⁻¹
		Direct labour time utilization - batch	60	%
		Direct labour time utilization - continuous	70	%

	Lab, QC, QA	Laboratory, quality control, quality assurance	50	% TLC	
		Standard electricity	0.1	US\$× (kW×h) ⁻¹	
	Utilities	Chilled water	0.4	US\$ × tonne ⁻¹	
		Cooled water	0.1	US\$ × tonne ⁻¹	
		Steam	12	US\$ × tonne ⁻¹	
		Fixed R&D	0	US\$ × year ⁻¹	
		Variable R&D	0	US\$ × g MP ⁻¹	
	Miscellaneous	On-going process validation	0	US\$ × year ⁻¹	
		Other fixed	0	US\$ × year ⁻¹	
		Other variable	0	US\$ × g MP ⁻¹	
		Construction period	20	months	
		Start-up period	4	months	
		Project lifetime	20	years	
	Time valuation	Inflation	4	%	
		NPV interest - Low	7	%	
		NPV interest - Medium	9	%	
		NPV interest - High	11	%	
		Loan interest for DFC	9	%	
		Loan interest for working capital	12	%	
		Loan interest for up front R&D	12	%	
		Loan interest for up front royalties	12	%	
		Loan period for DFC	10	years	
	Overall economic evaluation	Loan period for working capital	6	years	
		Financing	Loan period for up front R&D	6	years
			Loan period for up front royalties	6	years
			DFC outlay for 1 st year	30	% of DFC
			DFC outlay for 2 nd year	40	% of DFC
			DFC outlay for 3 rd year	30	% of DFC
			DFC outlay for 4 th year	0	% of DFC
			DFC outlay for 5 th year	0	% of DFC
			Straight line depreciation period	10	years
			Salvage value	5	% of DFC
	Production level	Operating capacity for each year	100	%	
			Product failure rate	5	%

	Disposal cost	0	US\$ × g MP ⁻¹
	Income tax	40	%
Miscellaneous	Fixed advertising and selling expenses	0	US\$ × year ⁻¹
	Variable advertising and selling expenses	0	US\$ × g MP ⁻¹
	Variable running royalty expenses	0	US\$ × g MP ⁻¹

Abbreviations used in Table S1: CapEx – capital expenditure; OpEx – operating expense; TEPC – total equipment purchase cost; UEPC – unlisted equipment purchase cost; DFC – direct fixed capital; DC – direct cost; IC – indirect cost; OC – other cost; TLC – total labour costs; BOLR – basic operator labour rate; g MP – gram of main product. *calculated based on benefits, operating supplies, supervision cost and administration cost.

Drug substance production (aka. primary manufacturing) modelling as well as drug product manufacturing (aka. fill-to-finish, secondary manufacturing) modelling has been carried out using SuperPro Designer Version 11, Build 2 from Intelligen, Inc. The input parameters and assumptions for drug substance and drug product techno-economic modelling in SuperPro Designer are listed in **Table S1** below. Most of these parameters listed in Table S1 were kept at the default values from SuperPro Designer, as these default values are representative for biopharmaceutical production process and cost modelling. The Building Cost within the Direct Costs used for CapEx calculations was changed from the default value to 250 % of the total equipment purchase cost (TEPC), as this value is more representative of GMP production processes which have higher facility costs. Updating this Building Cost to 250 % of the TEPC was recommended by Demetri Petrides the from Intelligen, Inc who developed SuperPro Designer. The working capital cost period was decreased from the default value to 10 days because RNA vaccine production is faster compared to conventional cell-base biopharmaceutical production for which the default working capital cost period value was representative. The laboratory quality control (QC) and quality assurance (QA) costs were increased to 50% of the total labour costs (TLC) because this is a new technology and quality testing is likely to be more expensive compared to more established technologies. The impact of the QC/QA on the cost per dose was evaluated in Figure 1B and by changing the QC/QA costs between 15 – 65% of TLC the impact on the cost per dose was minimal. The time between consecutive batches (aka. cycle slack time) was set to 3 hours for production process models at the 30 L scale and to 2 hours for production process models at a lower scale. All production processes were modelled to operate 330 days per year. The number of campaigns per year was set to 1 in all the drug substance and drug product manufacturing models. The labour cost for drug substance production processes (operated in batch mode) was calculated using the detailed labour estimate, in function of the basic labour rate, benefits, operating supplies, supervision cost and administration cost. The labour cost for fill-to-finish processes (operated in continuous mode) was calculated using the lumped labour estimate. All other parameters shown in Table S1 were kept at the default values in SuperPro Designer.

The purchase price of CleanCap 5' capping analogues at GMP grade was received from the supplier, TriLink BioTechnologies Inc [11].

The purchase price of CleanCap AG or CleanCap AU stated in this publication were estimated by the authors and are not representative of actual pricing. TriLink BioTechnologies LLC (San Diego, CA, USA) did not supply CleanCap AG or CleanCap AU to Imperial College London at the purchase price estimated in this publication.

The purchase price of the modified UTP (N1-methylpseudouridine-5'-triphosphate) was estimated based on the selling price of this material taking into account a discounting factor obtained by dividing the list price of the CleanCap AU 5' capping analogues with the price quoted by TriLink BioTechnologies Inc for large scale GMP grade supply of the same material. Subsequently, a purchase price value was also received for the modified

UTP from TriLink BioTechnologies Inc which was within the uncertainty range listed in **Figure 1**.

The SuperPro Designer modelling files and data is available in a publicly accessible repository: <https://github.com/ZKis-ZK/LNP-formulated-RNA-vaccine-drug-substance-production-cost-modelling>.

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