

Article

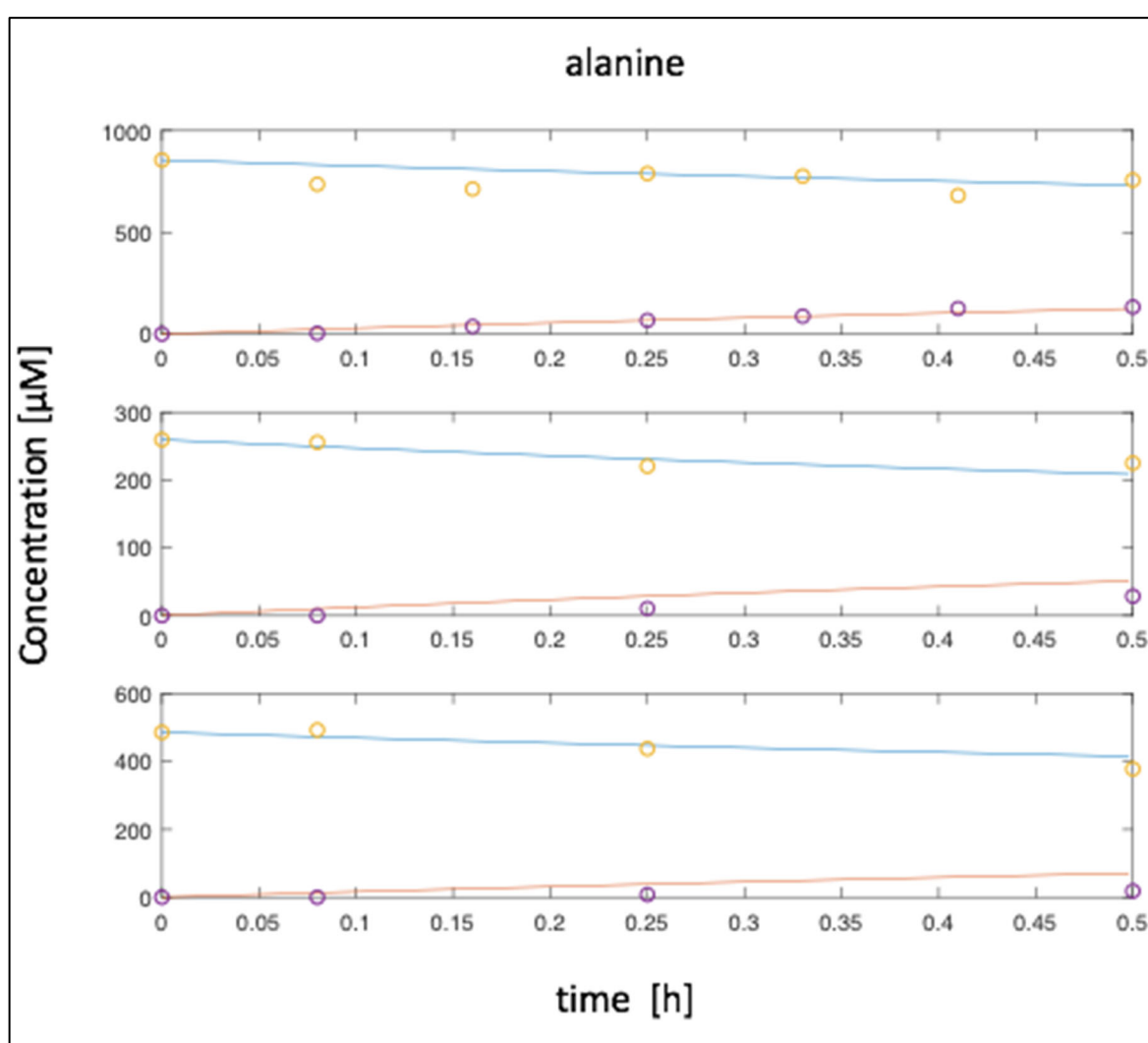
# A Two-Compartment Fermentation System to Quantify Strain-Specific Interactions in Microbial Co-Cultures

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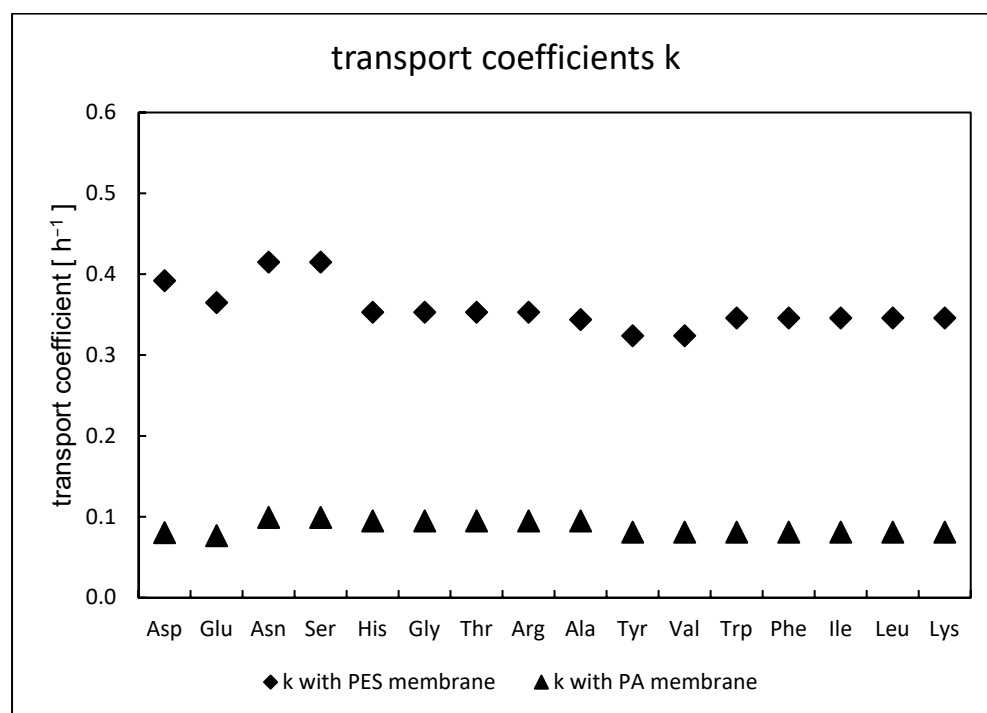
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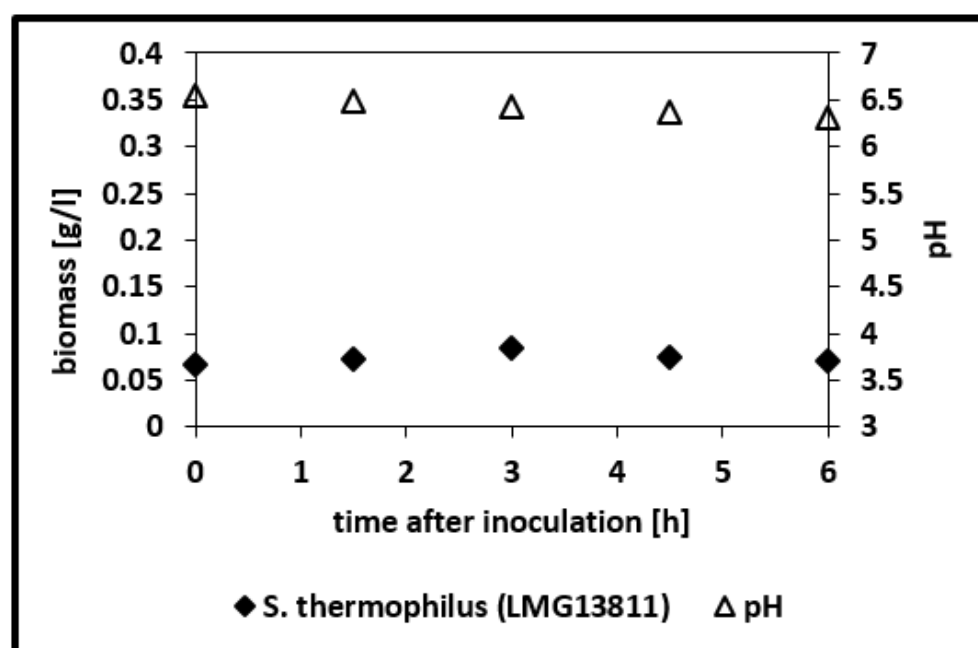
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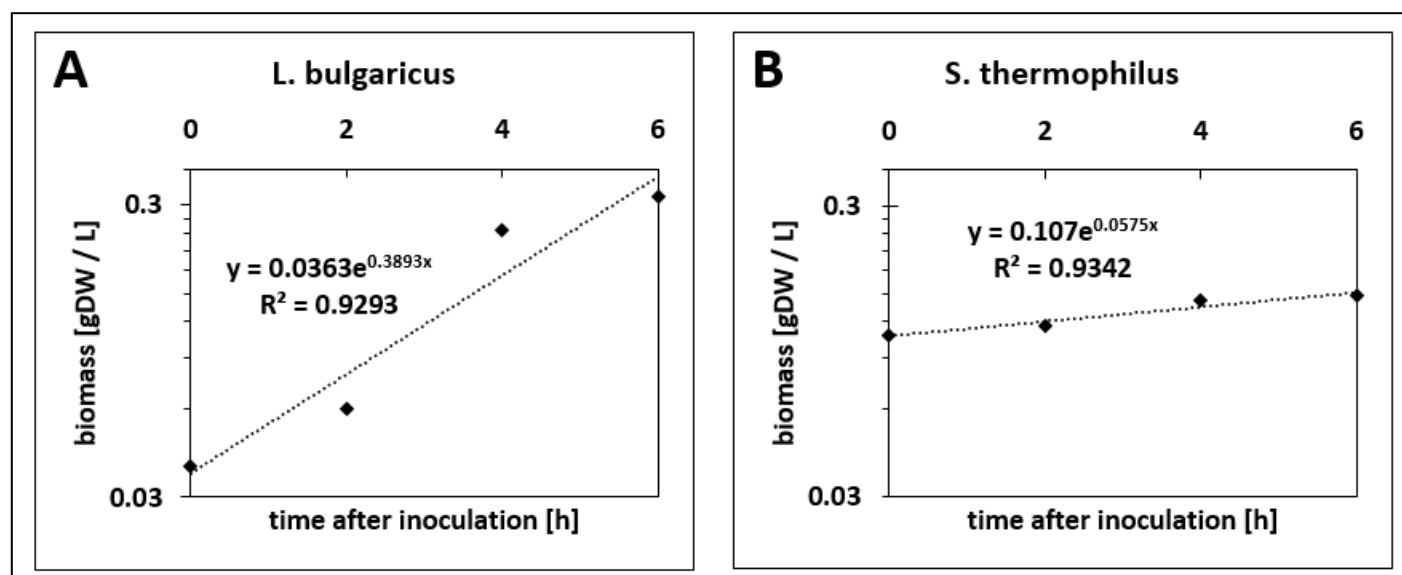
**Figure S1.** Alanine concentrations are measured to determine the transport coefficient  $k_{alanine}$  (purple circles: amino acid concentrations in compartment 1; orange circles: amino acid concentrations compartment 2). The process model was implemented in Matlab® and  $k_{alanine}$  was optimized. Lines: Simulated alanine concentrations based on initial alanine concentration at  $t = 0$  hours and estimated  $k_{alanine} = 0.34 \text{ h}^{-1}$  for three independent experiments with different initial alanine concentrations.



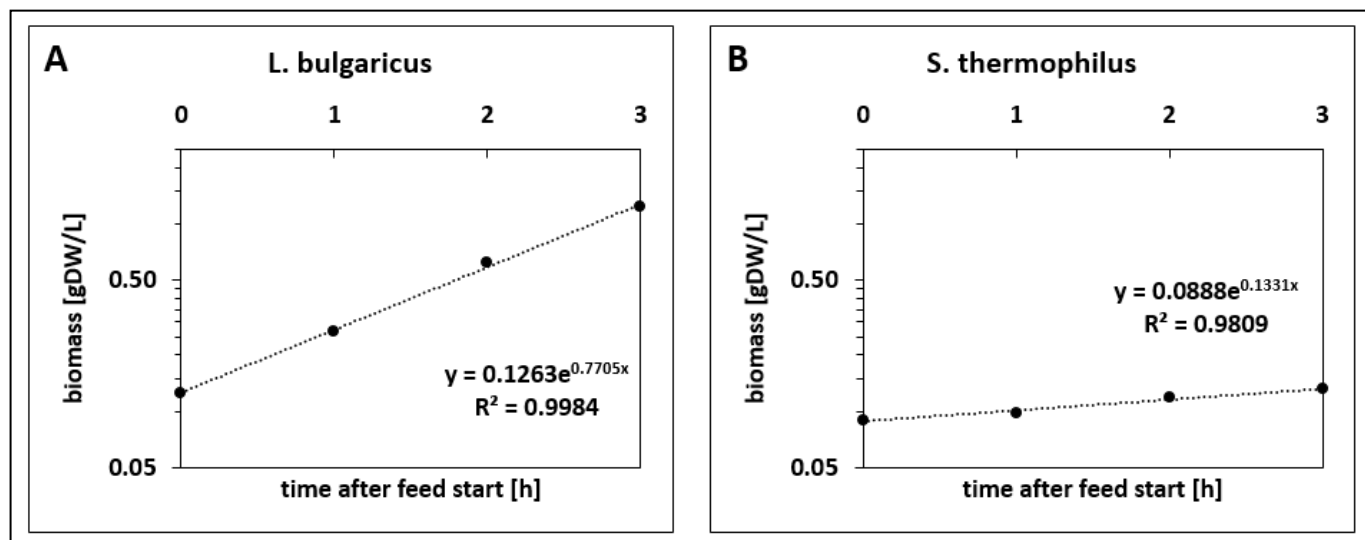
**Figure S2.** Amino acid transport coefficients  $k_i$  estimated for the membrane unit with an integrated PES (rhomb) or PA (triangle) membrane, attached to the vessel bioreactor system.



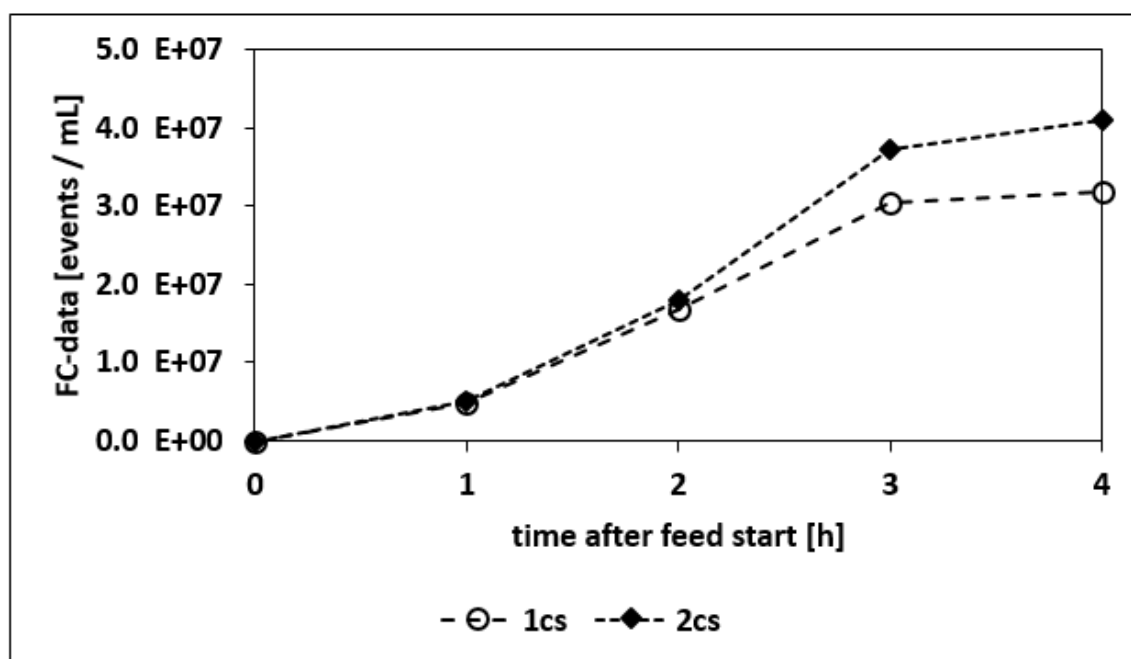
**Figure S3.** Cultivation of *S. thermophilus* in a crimp-top serum bottle containing synthetic medium with casein and lactose. Biomass was monitored by flow cytometry (rhomb).



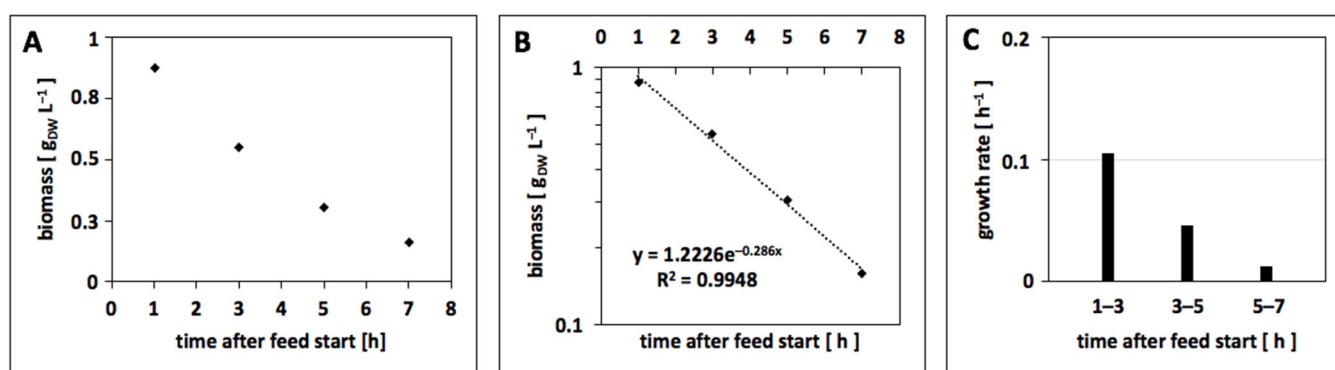
**Figure S4.** Growth of *L. bulgaricus* (A) and *S. thermophilus* (B) in vessel bioreactor system. The *S. thermophilus*-compartment was filled with SM + lactose, and the *L. bulgaricus*-compartment was filled with SMcas + lactose. Samples were analysed by flow cytometry to calculate biomass. Growth rates were calculated from zero to six hours:  $\mu$  (*S. thermophilus*) = 0.06 h<sup>-1</sup> and  $\mu$  (*L. bulgaricus*) = 0.39 h<sup>-1</sup>.



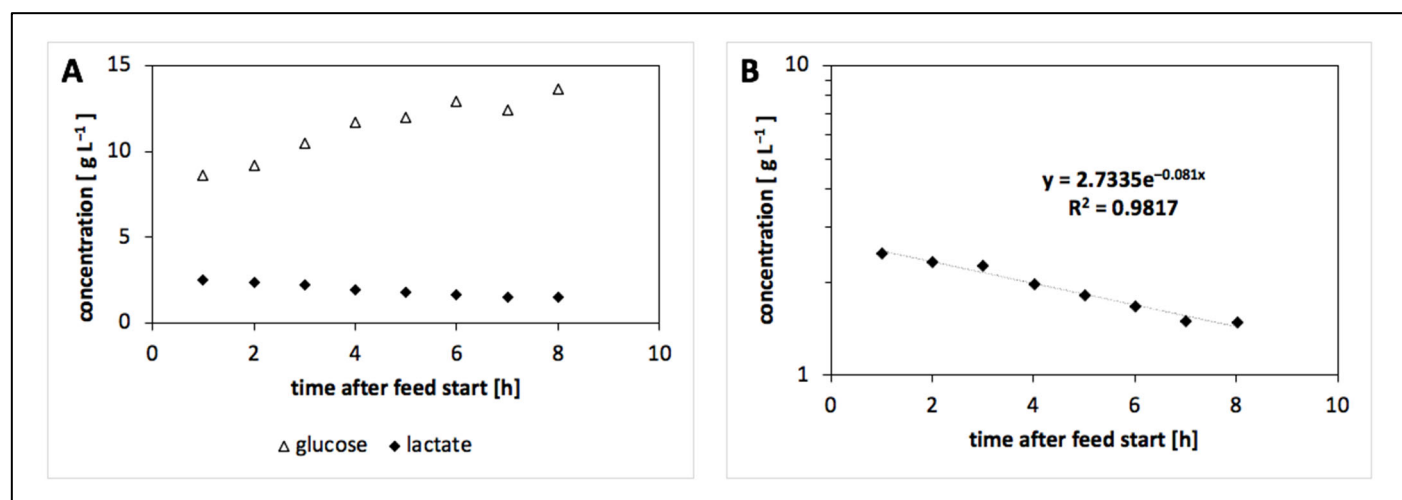
**Figure S5.** Growth rate of *L. bulgaricus* (A) and *S. thermophilus* (B) in tube-bioreactor-system. The *S. thermophilus*-compartment was filled with SM + lactose, and the *L. bulgaricus*-compartment was filled with SMcas + lactose. Samples were analysed by flow cytometry to calculate biomass. The dilution rate for each compartment was  $D = 0.14$  h<sup>-1</sup>. This results in  $\mu$  (*L. bulgaricus*) = 0.77 h<sup>-1</sup> + 0.14 h<sup>-1</sup> = 0.91 h<sup>-1</sup>, and  $\mu$  (*S. thermophilus*) = 0.13 h<sup>-1</sup> + 0.14 h<sup>-1</sup> = 0.27 h<sup>-1</sup>.



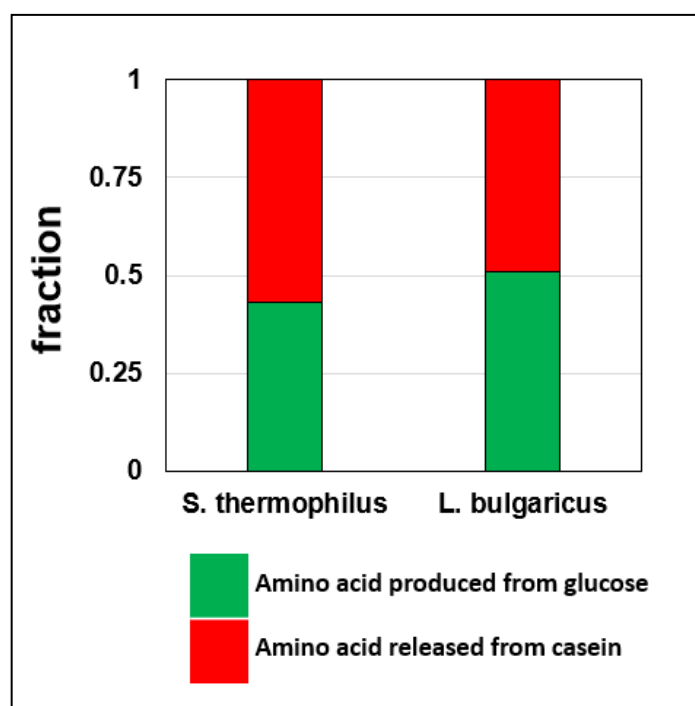
**Figure S6.** (open circles) Cell events of a co-culture grown in a crimp-top serum bottle measured by flow cytometry. (filled rhomb) The biomass in each compartment of a tube-bioreactor-system was analysed by flow cytometry and summed up. The initial FC-data ( $t = 0$  hour) were subtracted from all values to normalize and compare data sets.



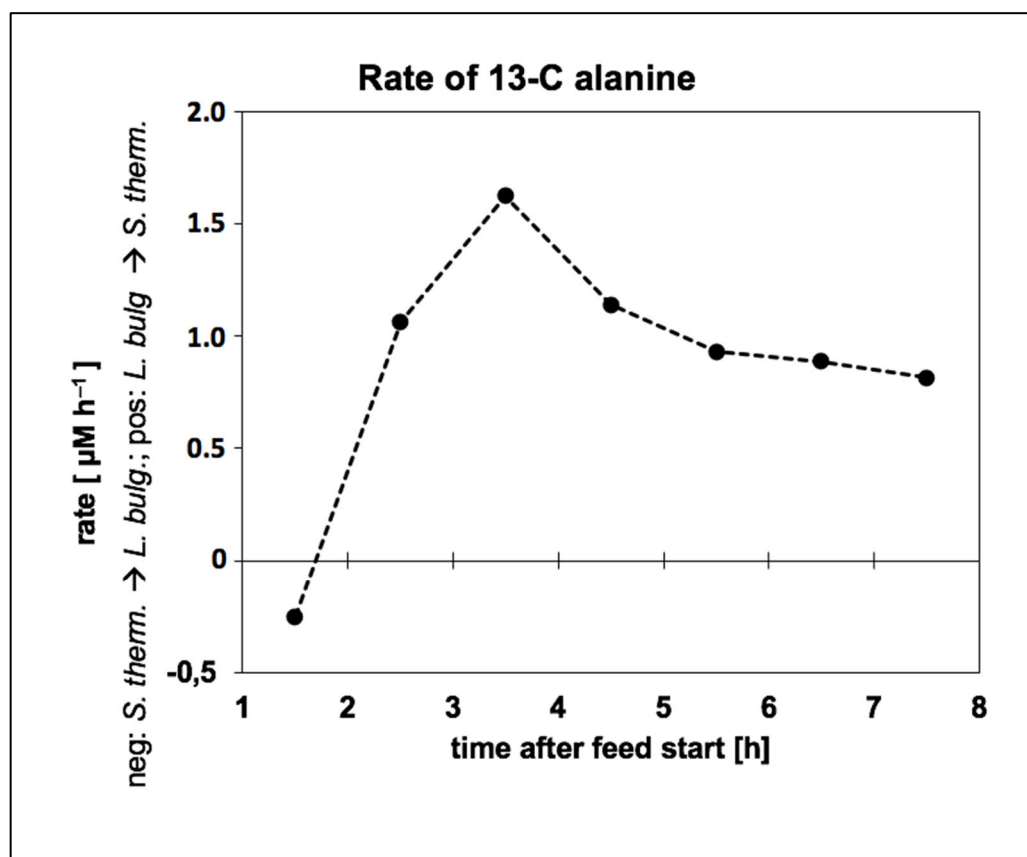
**Figure S7.** (A) Biomass of *S. thermophilus* in tube-bioreactor-system. The *S. thermophilus*-compartment was filled with SM + glucose, and the *L. bulgaricus*-compartment was filled with SMcas+glucose. Biomass in *S. thermophilus*-compartment was monitored by optical density. (B) Calculated growth rate  $\mu$  with a dilution rate of  $D = 0.34 h^{-1}$  results in  $\mu = (-0.29 h^{-1} + 0.34 h^{-1}) = 0.05 h^{-1}$ . (C) Calculated growth rate  $\mu$  for each time step.



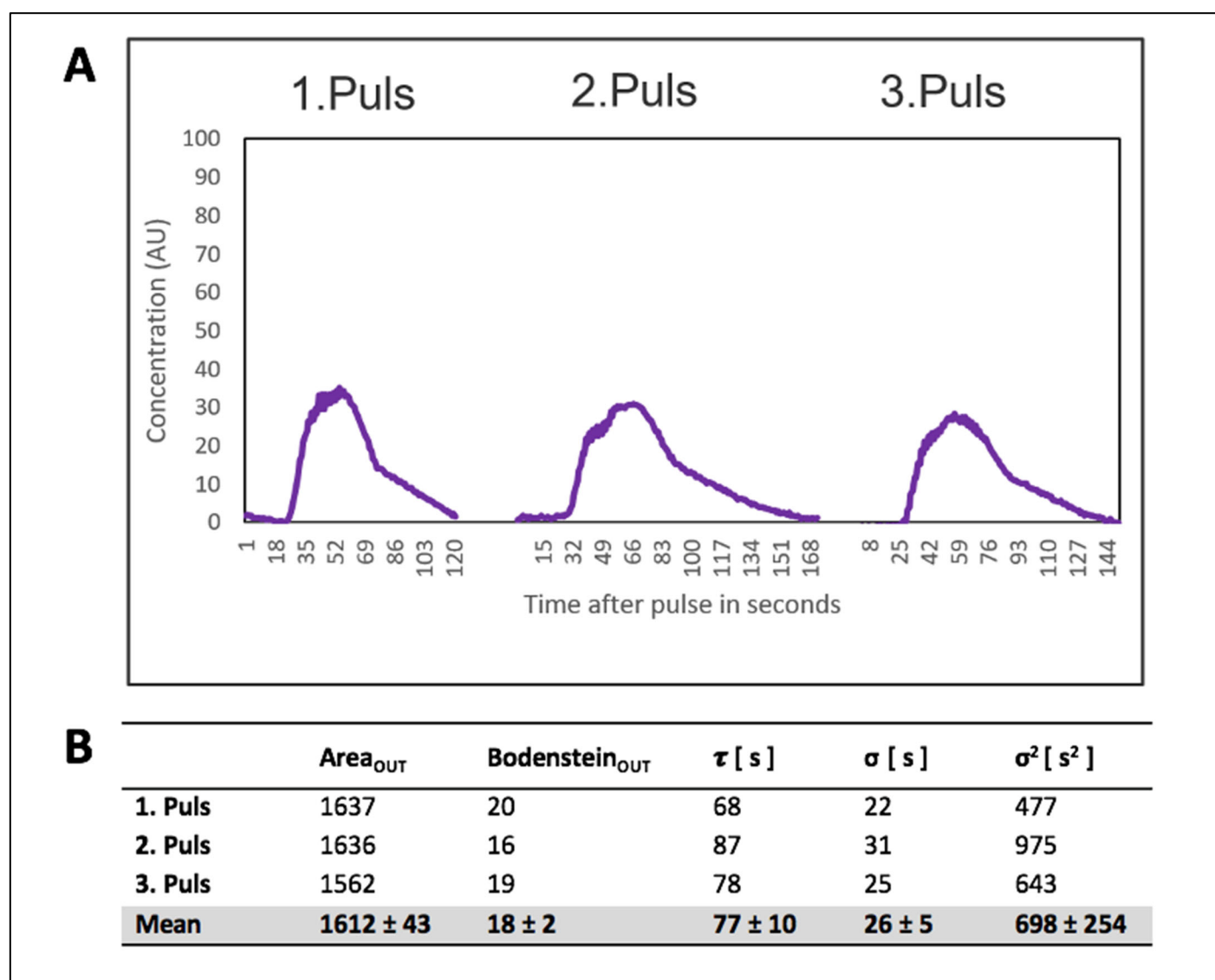
**Figure S8.** Glucose and lactate concentrations in *S. thermophilus*-compartment measured by HPLC. (A) Strains were cultivated in tube-bioreactor-system filled with SMcas+glucose in the *L. bulgaricus*-compartment ( $D = 0.07 \text{ h}^{-1}$ ) and SM+glucose in the *S. thermophilus*-compartment ( $D = 0.34 \text{ h}^{-1}$ ). (B) Lactate production rate in *S. thermophilus*-compartment (considering  $D = 0.34 \text{ h}^{-1}$ ):  $r = -0.08 \text{ h}^{-1} + 0.34 \text{ h}^{-1} = 0.26 \text{ h}^{-1}$ .



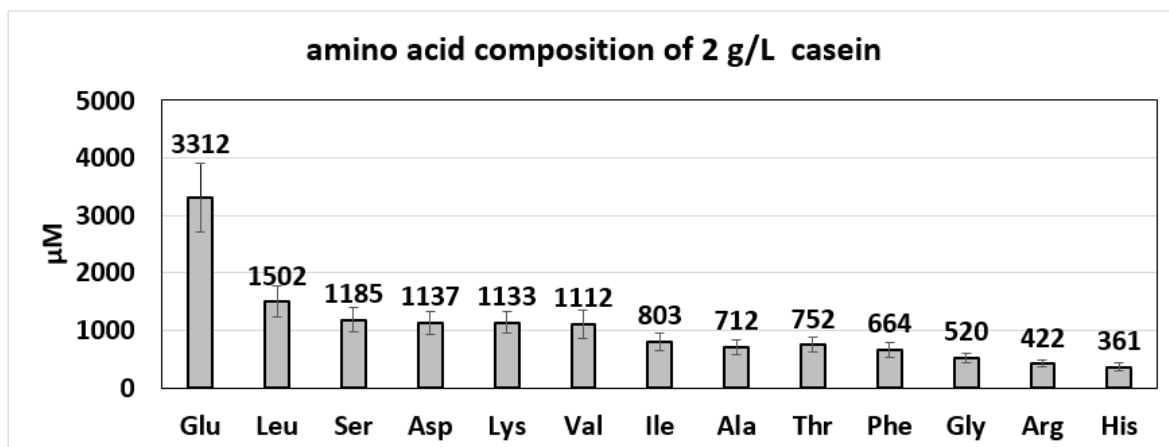
**Figure S9.** Fractions [mol/mol] of alanine isotopologues:  $m + 0$ ,  $m + 1$ , and  $m + 2$  were corrected for natural isotopologues. Fully <sup>13</sup>C labeled ( $m + 3$ ) alanine is shown in red. The green fraction indicates alanine hydrolysed from casein and the red fraction indicates alanine produced from glucose. Strains were cultivated in tube-bioreactor-system containing SMcas + <sup>13</sup>C glucose in the *L. bulgaricus*-compartment, and SM + <sup>13</sup>C glucose in the *S. thermophilus*-compartment. After 24 hours, intracellular metabolites were analysed from strains in each compartment by LC-MS/MS.



**Figure S10.** Diffusion rate of 13-C alanine across the membrane in tube-bioreactor-system filled with *L. bulgaricus* and *S. thermophilus*. Negative rates: diffusion from *S. thermophilus*-compartment to *L. bulgaricus*-compartment. Positive rates: diffusion from *L. bulgaricus*-compartment to *S. thermophilus*-compartment.



**Figure S11.** (A)  $r$ -values at the outlet of the membrane unit (violet curve). Change of the  $r$ -values was induced by a hydrochloric acid pulse at zero second. Three pulses were recorded to calculate the Bodenstein number in the membrane unit. (B) Calculated numbers to determine the Bodenstein number.



**Figure S12.** Amino acid composition of casein. 2 g/L casein was hydrolysed with HCL and amino acid concentrations were measured by HPLC. Numbers on top of each bar indicate exact concentration.



**Table S1.** Composition of the synthetic medium (SM). The SM contains all listed compounds, except amino acids or casein, and glucose or lactose, respectively.

Category	Compound	Concentration [g L <sup>-1</sup> ]	CAS Number
	Di-potassium hydrogen phosphate	2.5	7758-11-4
	Potassium dihydrogen phosphate	3	7778-77-0
	Sodium acetate	1	127-09-3
	Ammonium citrate tribasic	0.6	3458-72-8
	Manganese sulfate monohydrate	0.02	10034-96-5
	Iron(II) sulfate heptahydrate	0.00132	7782-63-0
	Calcium chloride dihydrate	0.08745	10035-04-8
	Tween 80	1 mL/L	9005-65-6
	D-Lactose monohydrate	15.75	10039-26-6
	Glucose monohydrate	15.75	14431-43-7
	Magnesium sulfate heptahydrate	0.2	10034-99-8
	Urea	0.12	57-13-6
nucleobases	Adenine	0.01	73-24-5
	Guanine	0.01	73-40-5
	Uracil	0.01	66-22-8
	Xanthine	0.01	69-89-6
vitamins	Biotin	0.0002	58-85-5
	Folic acid	0.0002	59-30-3
	Pyridoxal hydrochloride	0.001	65-22-5
	Riboflavin	0.0005	83-88-5
	Thiamine chloride hydrochloride	0.0005	67-03-8
	Nicotinamide	0.0005	98-92-0
	Cyanocobalamin	0.0005	68-19-9
	4-Aminobenzoic acid	0.0005	150-13-0
	D-Pantothenic acid hemicalcium salt	0.004	137-08-6
	DL-6,8-thioctic acid	0.0005	1077-28-7
trace elements	Ammonium molybdate tetrahydrate	0.0000037	12054-85-2
	Cobalt(II) chloride hexahydrate	0.000007	7791-13-1
	Boric acid	0.000025	10043-35-3
	Copper(II) sulfate pentahydrate	0.0000025	7758-99-8
	Zinc sulfate heptahydrate	0.0000029	7446-20-0
amino acids	L-Alanine	0.1	56-41-7
	L-Arginine	0.317	74-79-3
	L-Asparagine monohydrate	0.343	5794-13-8
	L-Aspartic acid	0.499	56-84-8
	L-Cysteine hydrochloride monohydrate	0.3	7048-04-6
	L-Glutamic acid	0.331	56-86-0
	L-Glutamine	0.29	56-85-9
	Glycine	0.16	56-40-6
	L-Histidine monohydrochloride monohydrate	0.273	5934-29-2
	L-Isoleucine	0.361	73-32-5

	L-Leucine	0.6	61-90-5
	L-Lysine	0.351	56-87-1
	L-Methionine	0.119	63-68-3
	L-Phenylalanine	0.34	63-91-2
	L-Proline	0.921	147-85-3
	L-Serine	0.359	56-45-1
	L-Threonine	0.3	72-19-5
	L-Tryptophan	0.102	73-22-3
	L-Tyrosine	0.12	60-18-4
	L-Valine	0.468	72-18-4
casein	Casein	2	9005-46-3

[illegible][illegible]

	0	4	1	0	5	0	3	0	0	0	0	6	0	1	2	6	0
	0	52	28	18	42	13	26	28	18	11	2	47	3	23	32	54	22
	1	122	67	44	97	33	59	67	44	29	14	105	11	53	73	121	57
PES Expt.3 comp1	0	1805	1063	688	1548	541	1076	1063	778	486	279	1523	214	834	1143	1938	999
	0	1874	1087	701	1557	546	1034	1084	785	493	284	1564	217	842	1164	1945	1003
	0	1648	961	626	1365	488	915	959	699	438	248	1399	192	752	1048	1748	896
	1	1458	835	545	1174	421	741	846	599	379	216	1277	169	657	914	1498	776
PES Expt.3 comp2	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
	0	6	2	0	6	0	3	1	0	0	0	6	0	1	2	6	0
	0	40	20	13	33	9	22	21	10	8	2	35	0	15	22	38	14
	1	79	40	28	65	18	43	43	23	18	7	65	5	32	44	74	31
PA Expt.1 comp1	0	1089	628	419	877	320	555	628	456	280	162	952	131	510	685	1129	598
	0	1030	590	385	842	296	541	593	426	266	150	877	119	468	639	1072	555
	0	1238	724	386	1219	302	779	723	522	329	188	1146	147	566	778	1306	546
	1	1141	666	366	1095	282	679	666	484	299	175	1111	138	534	724	1195	507
PA Expt. 1 comp2	0	2	1	0	1	0	1	0	0	0	0	11	3	2	1	2	0
	0	12	7	4	11	2	8	7	4	3	2	20	1	7	8	12	4
	0	36	20	12	35	8	23	21	12	10	5	41	4	17	22	35	13
	1	72	39	23	69	16	46	41	24	19	10	73	7	32	42	68	26
PA Expt. 2 comp1	0	2043	1226	652	2190	520	1556	1236	910	573	317	1913	248	963	1313	2293	964

	0	1933	1156	618	2047	490	1425	1163	859	535	299	1784	238	915	1233	2146	921
	0	1807	1075	567	1902	450	1303	1082	788	497	277	1658	217	837	1145	1989	842
	1	1635	968	521	1698	411	1149	977	718	446	252	1512	203	777	1042	1792	775
<b>PA</b>	0	3	1	0	2	0	1	1	1	1	0	12	3	2	2	3	1
<b>Expt.2</b>																	
<b>comp2</b>																	
	0	8	4	3	8	2	6	4	0	3	1	17	3	1	5	8	3
	0	14	7	4	13	3	10	7	4	4	2	20	1	6	8	12	3
	1	19	10	6	19	4	15	10	5	5	3	25	2	8	10	16	5
<b>PA</b>	0	3132	1918	985	3714	805	3117	1935	1454	914	471	2896	371	1454	1991	3680	1536
<b>Expt.3</b>																	
<b>comp1</b>																	
	0	2917	1779	920	3368	746	2699	1789	1343	841	444	2664	349	1362	1855	3384	1425
	0	2697	1636	843	3085	684	2439	1644	1228	773	407	2473	318	1247	1707	3107	1300
	1	2668	1616	828	3030	671	2344	1623	1203	757	415	2445	313	1227	1683	3073	1281
<b>PA</b>	0	8	2	1	3	0	1	2	1	1	1	12	3	2	3	3	1
<b>Expt.3</b>																	
<b>comp2</b>																	
	0	26	14	9	26	7	18	15	10	7	4	34	3	13	17	26	11
	0	69	38	25	75	18	53	43	30	21	10	78	7	34	46	74	32
	1	138	77	50	151	36	105	87	59	42	20	146	18	66	91	147	62
	0	2768	1962	922	3088	73	2411	1663	1264	780	435	2531	335	1322	1781	3182	1300
	2	2512	1762	818	2682	67	1903	1508	1142	681	408	2335	314	1231	1643	2881	1165
	4	2408	1678	720	2481	65	1684	1411	1080	602	381	2173	296	1148	1534	2697	1115
	0	7	3	1	4	0	4	2	4	4	1	17	2	2	3	4	2
	2	613	293	4	660	8	427	406	238	82	83	587	74	300	378	657	227
	4	1011	483	47	1049	9	673	688	392	107	137	953	122	499	613	1074	368

**Table S3.** Amino acid concentrations ( $\mu\text{M}$ ) in *S. thermophilus*-compartment and *L. bulgaricus*-compartment cultivated in tube-bioreactor-system analysed by LC-MS/MS.

sample	time after feed start	glycine	alanine	serine	proline	valine	leucine	isoleucine	tyrosine	asparagine	threonine	lysine	glutamate	methionine	phenylalanine	arginine	tryptophan
$\mu\text{M}$	hour	$\mu\text{M}$	$\mu\text{M}$	$\mu\text{M}$	$\mu\text{M}$	$\mu\text{M}$	$\mu\text{M}$	$\mu\text{M}$	$\mu\text{M}$	$\mu\text{M}$	$\mu\text{M}$	$\mu\text{M}$	$\mu\text{M}$	$\mu\text{M}$	$\mu\text{M}$	$\mu\text{M}$	$\mu\text{M}$
<i>S. therm.</i> compartment	1	68	9	124	708	206	386	115	59	34	152	124	40	10	109	140	21
<i>S. therm.</i> compartment	2	57	9	101	677	188	366	100	53	24	137	110	27	5	98	130	18
<i>S. therm.</i> compartment	3	49	6	75	613	153	321	80	43	19	102	86	21	1	79	113	13
<i>S. therm.</i> compartment	4	38	4	57	559	125	281	62	37	13	74	62	19	0	65	96	10
<i>S. therm.</i> compartment	5	40	4	49	522	106	249	50	33	11	56	54	17	0	54	87	8
<i>S. therm.</i> compartment	6	26	3	39	482	80	197	34	27	8	38	40	14	0	39	72	6
<i>S. therm.</i> compartment	7	30	3	34	439	66	165	25	25	7	25	31	12	0	32	64	5
<i>S. therm.</i> compartment	8	31	4	29	388	52	129	18	21	6	18	26	9	0	22	56	4
<i>L. bulg.</i> compartment	1	26	4	39	358	66	166	33	18	11	36	48	17	4	30	73	5
<i>L. bulg.</i> compartment	2	42	11	81	562	142	299	77	42	32	82	89	49	1	69	116	13

<i>L. bulg.</i> compartment	3	58	17	111	675	192	368	107	64	34	113	114	63	0	96	131	18
<i>L. bulg.</i> compartment	4	62	12	91	639	169	340	91	56	24	94	100	45	0	85	121	15
<i>L. bulg.</i> compartment	5	48	9	71	587	138	297	70	47	17	68	78	31	0	67	104	12
<i>L. bulg.</i> compartment	6	52	9	60	551	115	261	54	41	13	47	61	24	0	52	94	10
<i>L. bulg.</i> compartment	7	46	8	49	492	87	209	36	33	10	27	43	17	0	34	77	7
<i>L. bulg.</i> compartment	8	39	8	41	458	75	173	26	30	8	16	32	15	0	24	68	7

**Code S1:** Determination of amino acid transport coefficient by least-square estimate in Matlab®.

```

% this code was written to determine the transport coefficient ki based on amino acid experiments
clear
error_best = 10000000;
load('data_for_k_PES.mat'); % amino acid concentrations
% Column Amino Acid
% Asp Glu Asn Ser His Gly Thr Arg Ala Tyr Val Trp Phe Ile Leu Lys
for col = 1:1:16;
data_for_k_one_aa = data_for_k(:,col);
for i = 0.2:0.001:0.5 % change ki
parameters = i;
% Time
time_delta = 0.083/10;
time_span = 0:time_delta:0.5; % in hours
%% FIRST EXPERIMENT
% initial conditions
c_aa_comp_1 = data_for_k_one_aa(1,1); % first expt
c_aa_comp_2 = 0;
c = [c_aa_comp_1 c_aa_comp_2];
% Integration
options = odeset('NonNegative',[1 2]);
f=@(t,x)balanceEquation(x,parameters);
[T1,Conc1] = ode45(f,time_span,c,options);
%% Second EXPERIMENT
% initial conditions
c_aa_comp_1 = data_for_k_one_aa(15,1); % first expt
c_aa_comp_2 = 0;
c = [c_aa_comp_1 c_aa_comp_2];
% Integration
options = odeset('NonNegative',[1 2]);
f=@(t,x)balanceEquation(x,parameters);
[T2,Conc2] = ode45(f,time_span,c,options);
%% Thirds EXPERIMENT
% initial conditions
c_aa_comp_1 = data_for_k_one_aa(23,1); % first expt
c_aa_comp_2 = 0;
c = [c_aa_comp_1 c_aa_comp_2];
% Integration
options = odeset('NonNegative',[1 2]);
f=@(t,x)balanceEquation(x,parameters);
[T3,Conc3] = ode45(f,time_span,c,options);

```



```

%% ERROR
error = abs(Conc1(11,2)- data_for_k_one_aa(9,1))+...
        abs(Conc1(21,2)- data_for_k_one_aa(10,1))+...
        abs(Conc1(31,2)- data_for_k_one_aa(11,1))+...
        abs(Conc1(41,2)- data_for_k_one_aa(12,1))+...
        abs(Conc1(51,2)- data_for_k_one_aa(13,1))+...
        abs(Conc1(61,2)- data_for_k_one_aa(14,1))+...
        abs(Conc2(11,2)- data_for_k_one_aa(20,1))+...
        abs(Conc2(31,2)- data_for_k_one_aa(21,1))+...
        abs(Conc2(61,2)- data_for_k_one_aa(22,1))+...
        abs(Conc3(11,2)- data_for_k_one_aa(28,1))+...
        abs(Conc3(31,2)- data_for_k_one_aa(29,1))+...
        abs(Conc3(61,2)- data_for_k_one_aa(30,1));
if error <= error_best
    error_best = error;
    k = parameters;
end
end
%% PLOT
% Integration
figure
subplot(3,1,1)
parameters = k ;
% initial conditions
c_aa_comp_1 = data_for_k_one_aa(1,1); % first expt
c_aa_comp_2 = 0;
c = [c_aa_comp_1 c_aa_comp_2];
% Integration
options = odeset('NonNegative',[1 2]);
f=@(t,x)balanceEquation(x,parameters);
[T1,Conc1] = ode45(f,time_span,c,options);
t_meas = [0 0.08 0.16 0.25 0.33 0.41 0.5];
c_meas_1_2 = data_for_k_one_aa(1:7,1);
c_meas_2_2 = data_for_k_one_aa(8:14,1);
plot(T1,Conc1)
hold on
scatter(t_meas,c_meas_1_2)
hold on
scatter(t_meas,c_meas_2_2)
% SEC EXPT
subplot(3,1,2)
parameters = k ;

```

```

% initial conditions
c_aa_comp_1 = data_for_k_one_aa(15,1); % first expt
c_aa_comp_2 = 0;
c = [c_aa_comp_1 c_aa_comp_2];
% Integration
options = odeset('NonNegative',[1 2]);
f=@(t,x)balanceEquation(x,parameters);
[T1,Conc1] = ode45(f,time_span,c,options);
t_meas = [0 0.08 0.25 0.5];
c_meas_1_3 = data_for_k_one_aa(15:18,1);
c_meas_2_3 = data_for_k_one_aa(19:22,1);
plot(T1,Conc1)
hold on
scatter(t_meas,c_meas_1_3)
hold on
scatter(t_meas,c_meas_2_3)
% THIRD EXPT
subplot(3,1,3)
parameters = k ;
% initial conditions
c_aa_comp_1 = data_for_k_one_aa(23,1); % first expt
c_aa_comp_2 = 0;
c = [c_aa_comp_1 c_aa_comp_2];
% Integration
options = odeset('NonNegative',[1 2]);
f=@(t,x)balanceEquation(x,parameters);
[T1,Conc3] = ode45(f,time_span,c,options);
t_meas = [0 0.08 0.25 0.5];
c_meas_1 = data_for_k_one_aa(23:26,1);
c_meas_2 = data_for_k_one_aa(27:30,1);
plot(T1,Conc3)
hold on
scatter(t_meas,c_meas_1)
hold on
scatter(t_meas,c_meas_2)
%%
k_total(col) = k;
end
%%
function dc_dt = balanceEquation(x0,parameters)
k = parameters(1);
dc_dt = zeros(2,1);

```

---

```
c_aa_comp_1 = x0(1);  
c_aa_comp_2 = x0(2);  
dc_dt(1) = k * (c_aa_comp_2 - c_aa_comp_1);  
dc_dt(2) = k * (c_aa_comp_1 - c_aa_comp_2);  
end
```